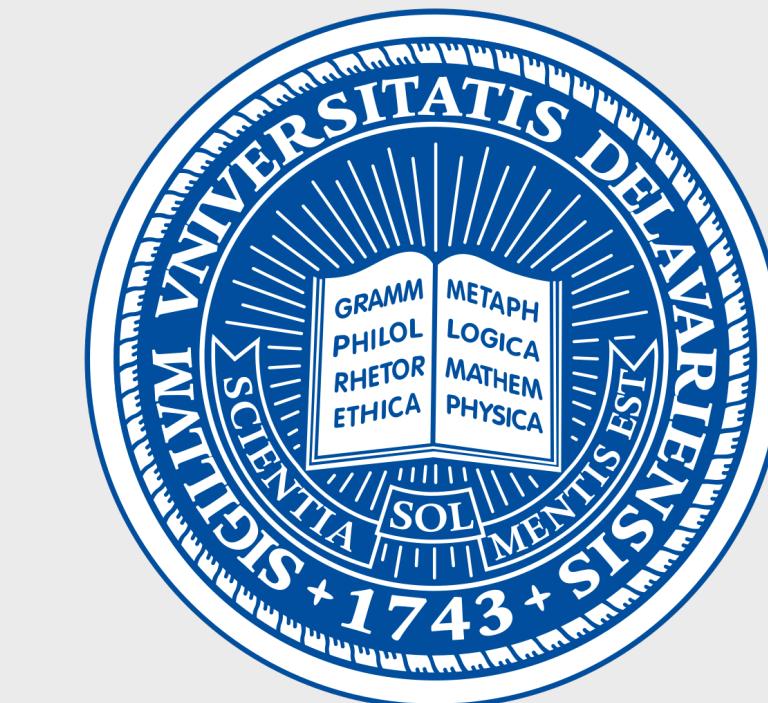


# Reduced Cooling Redundancy: A New Security Vulnerability in a Hot Data Center

Xing Gao<sup>1,2</sup>, Zhang Xu<sup>2</sup>, Haining Wang<sup>1</sup>, Li Li<sup>3</sup>, Xiaorui Wang<sup>3</sup>



1. University of Delaware

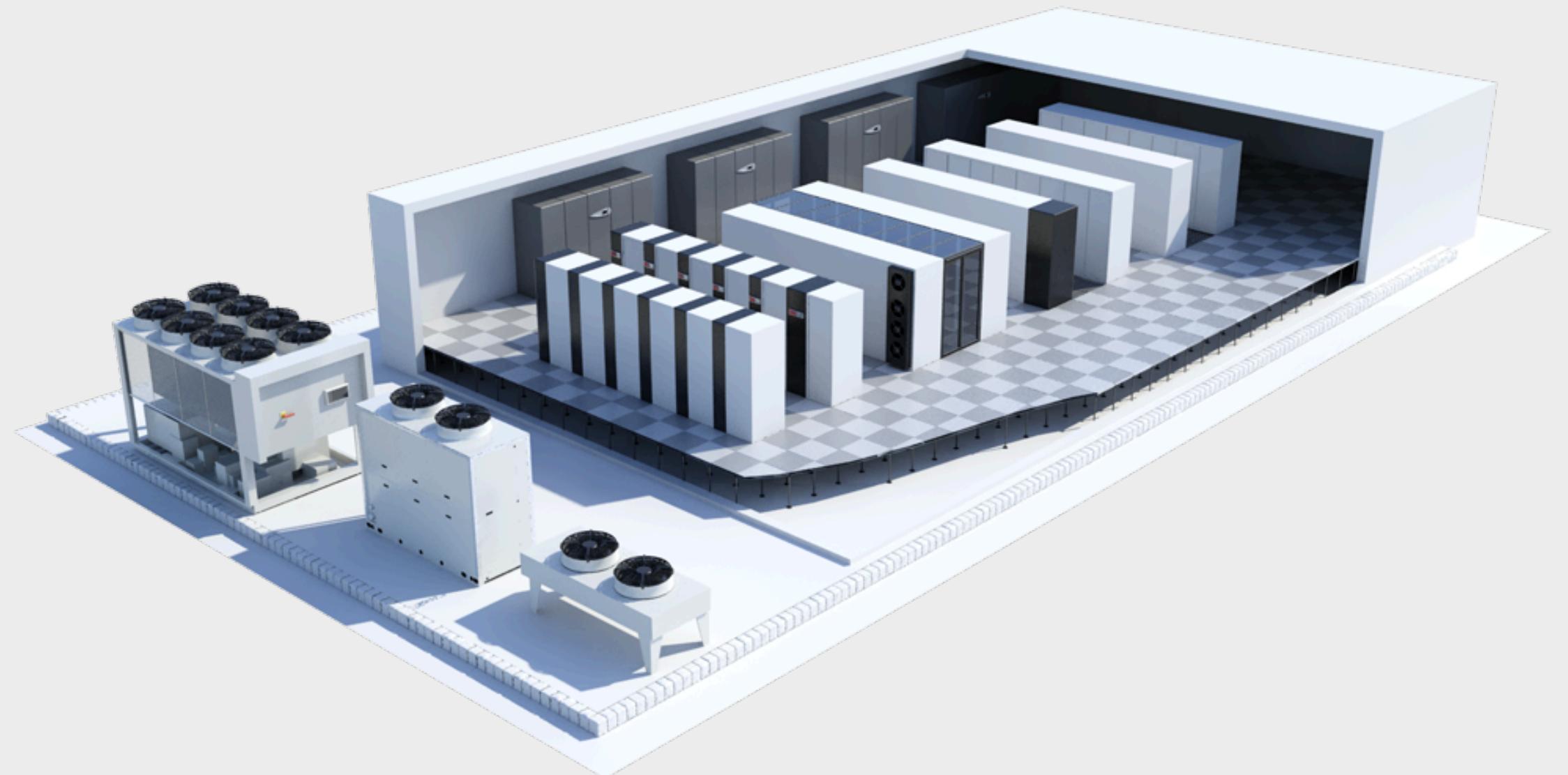


2. College of William and Mary

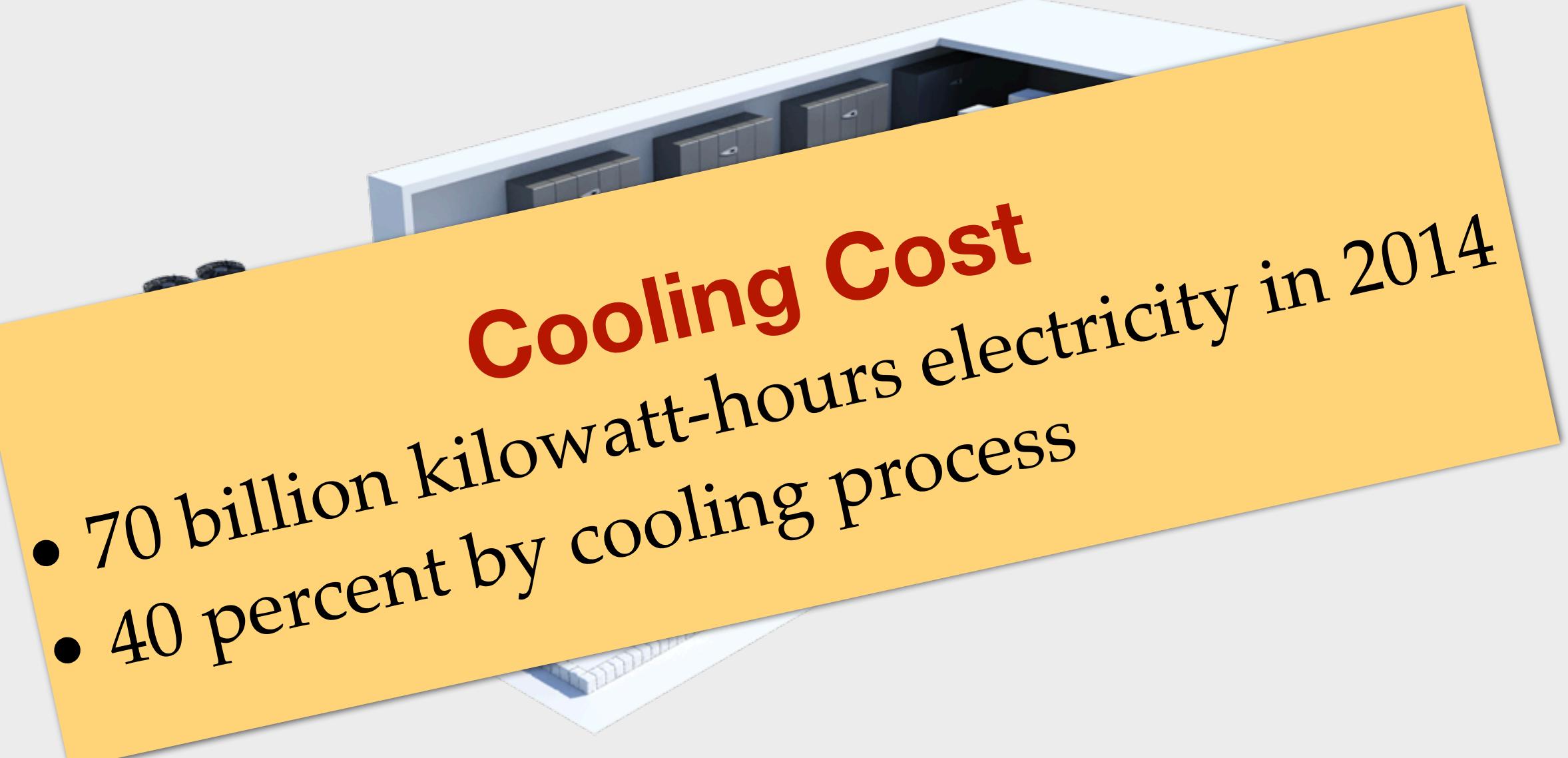


3. Ohio State University

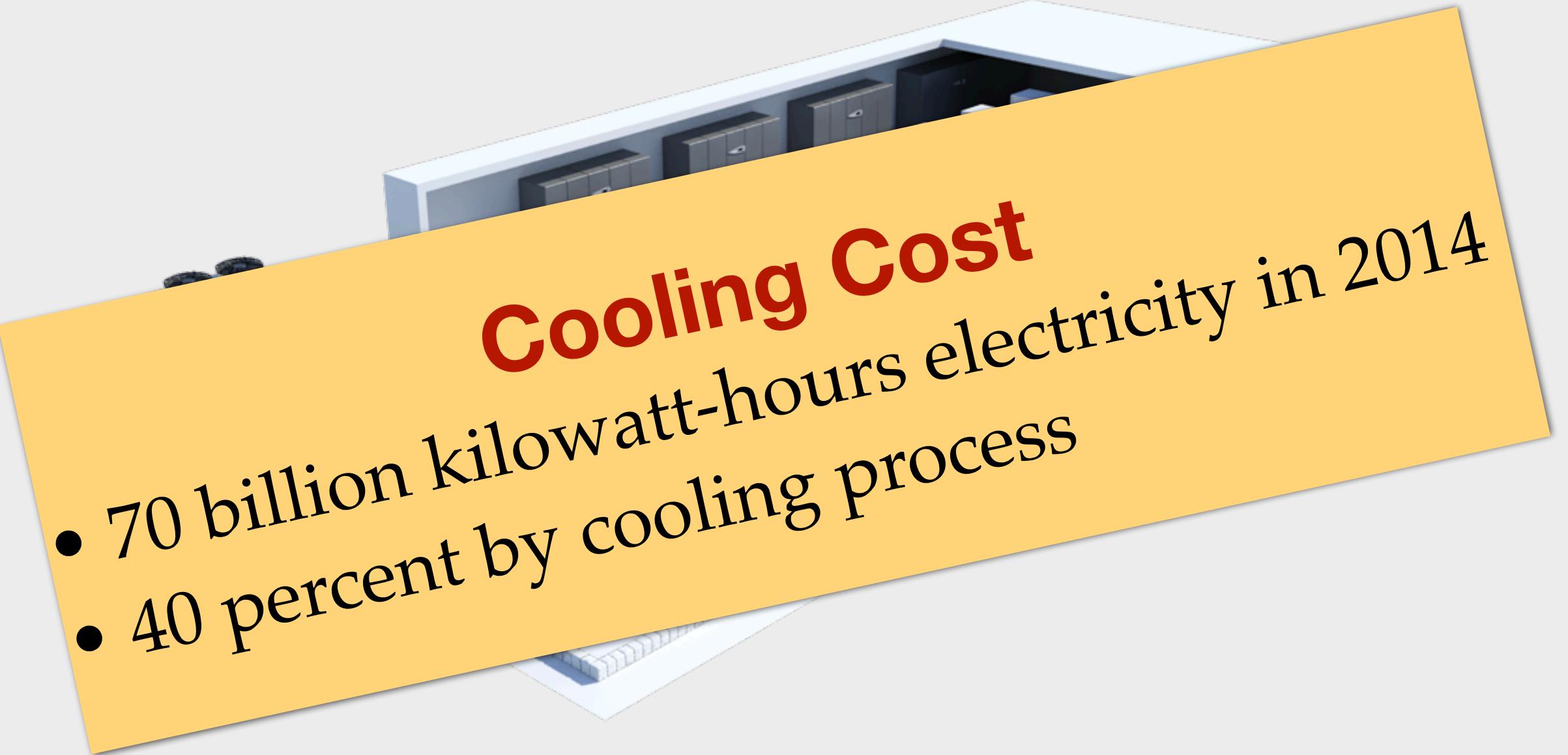
# Data Center Cooling Systems



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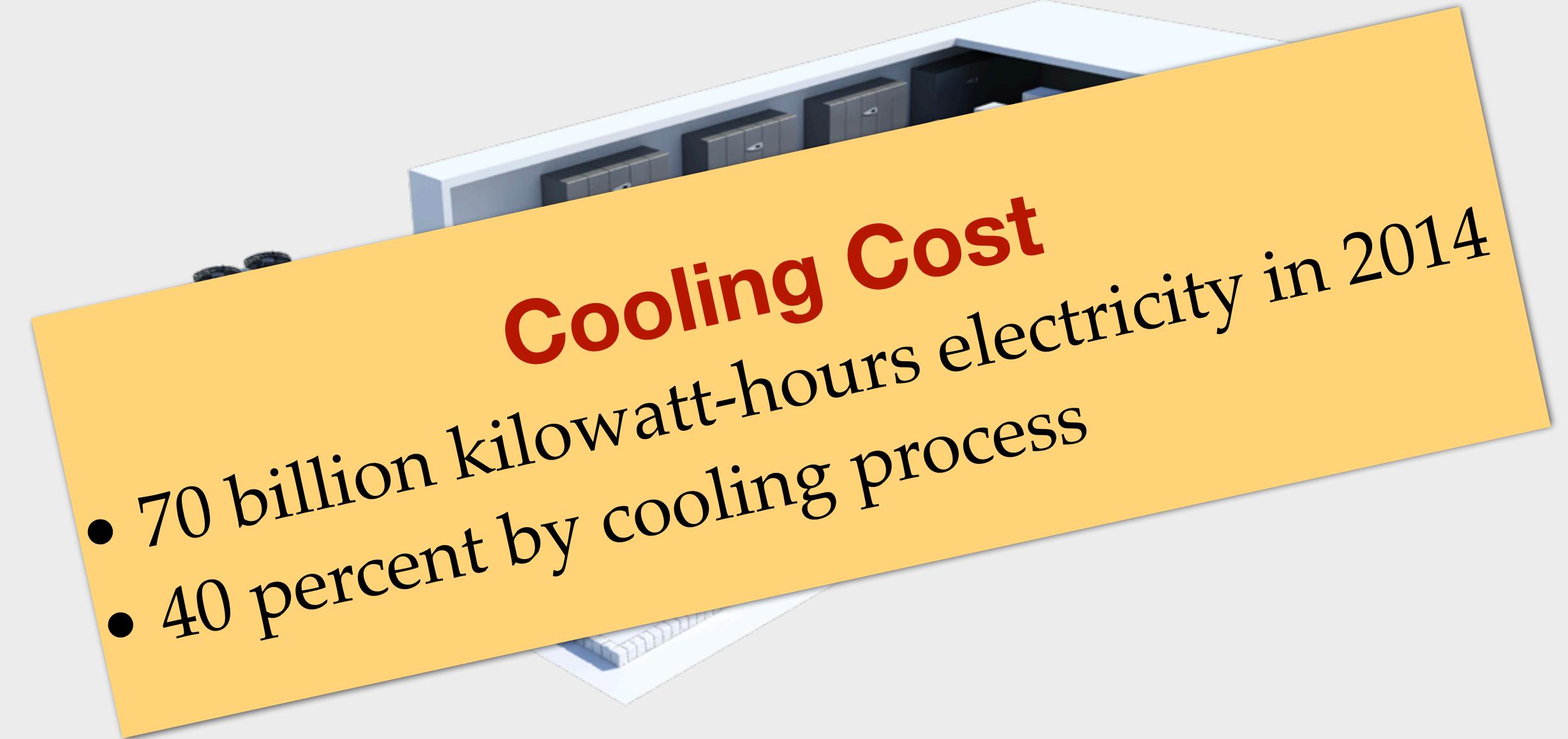
- 
- Cooling Cost**
- 70 billion kilowatt-hours electricity in 2014
  - 40 percent by cooling process

# Data Center Cooling Systems



CRAC Cooling

# Data Center Cooling Systems

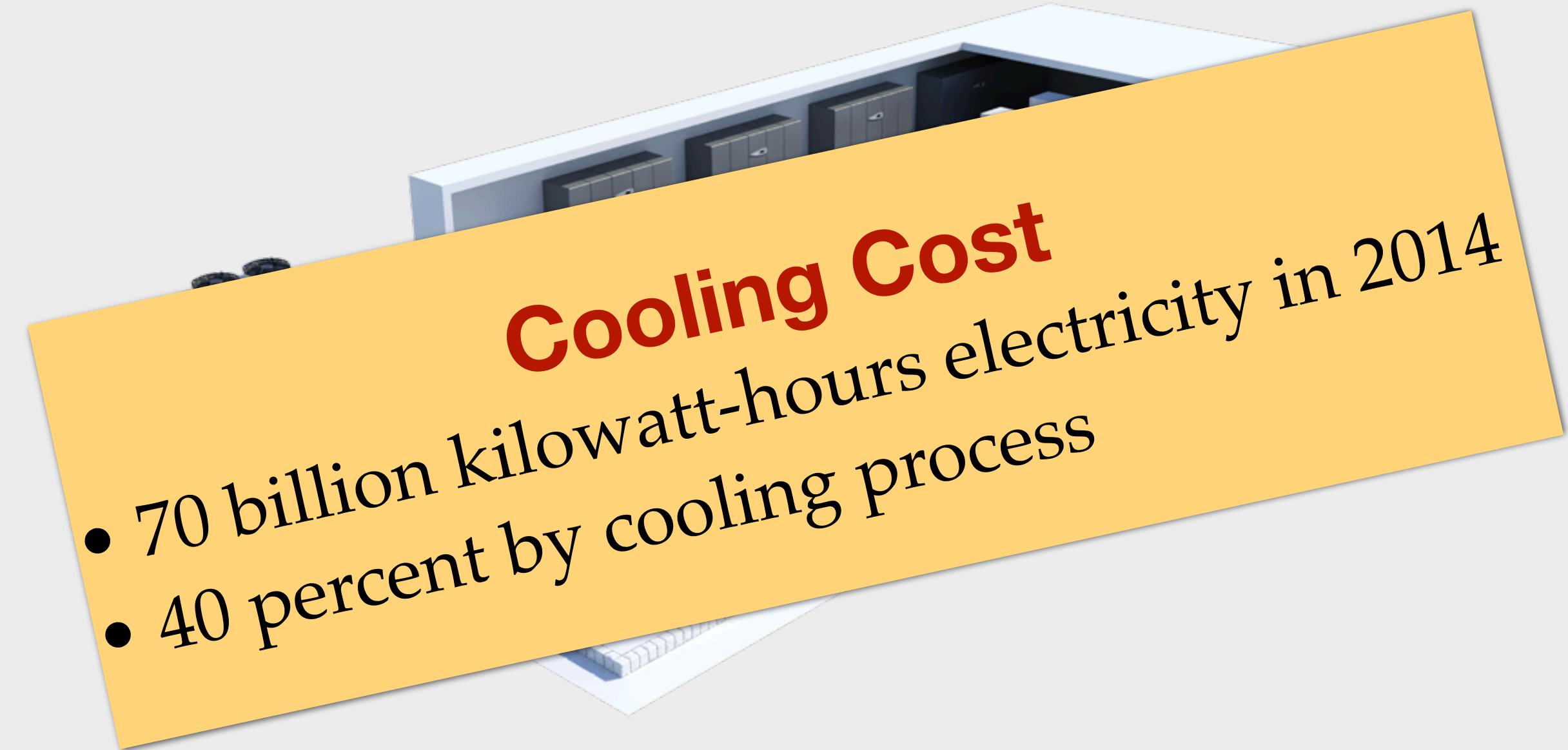


CRAC Cooling



Liquid Cooling

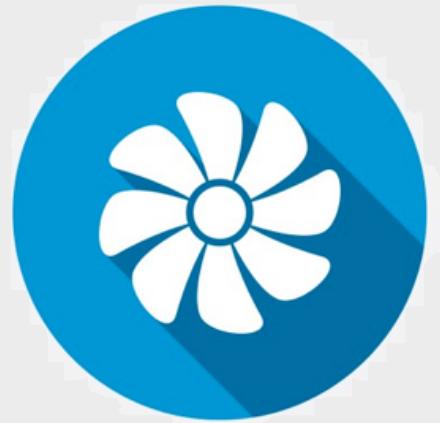
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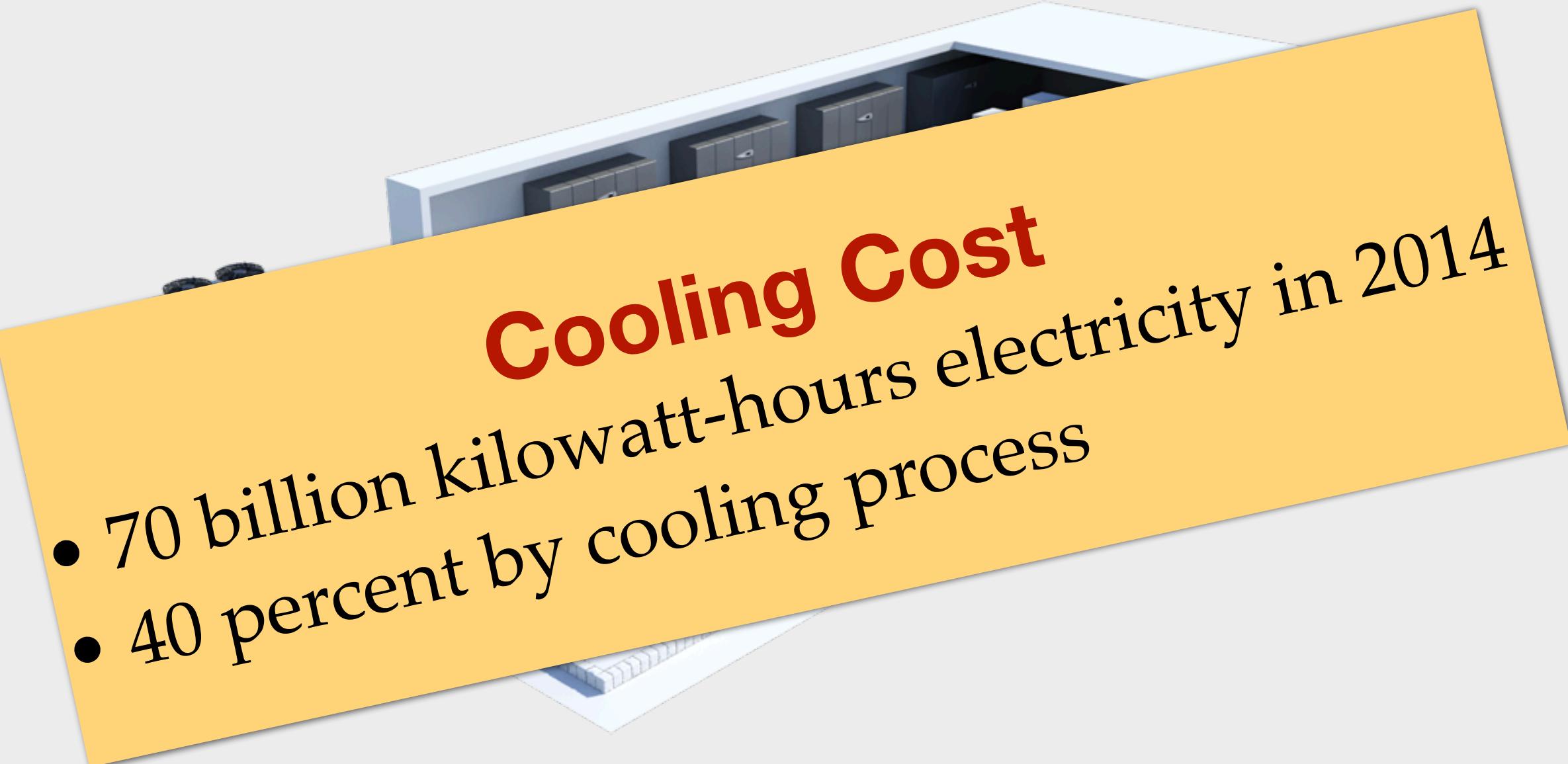


Liquid Cooling



Free Air Cooling

# Data Center Cooling Systems

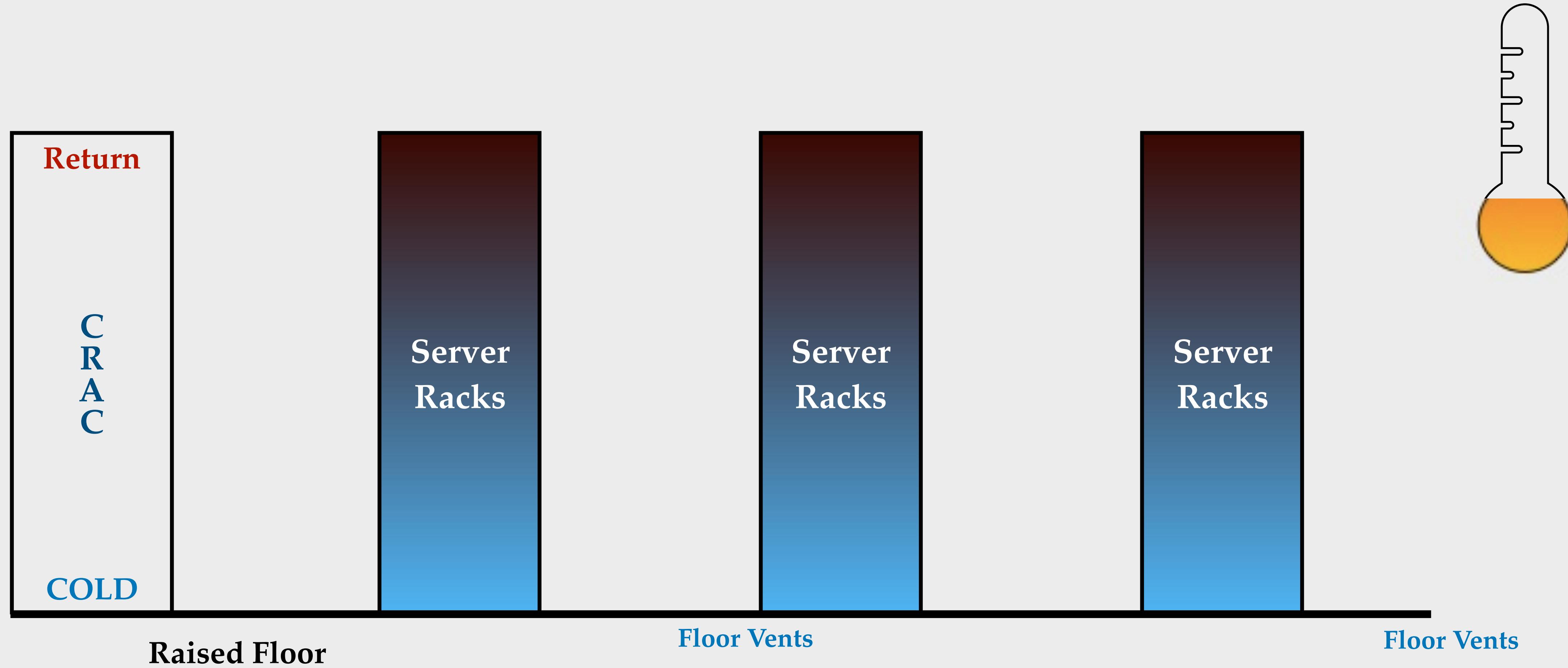


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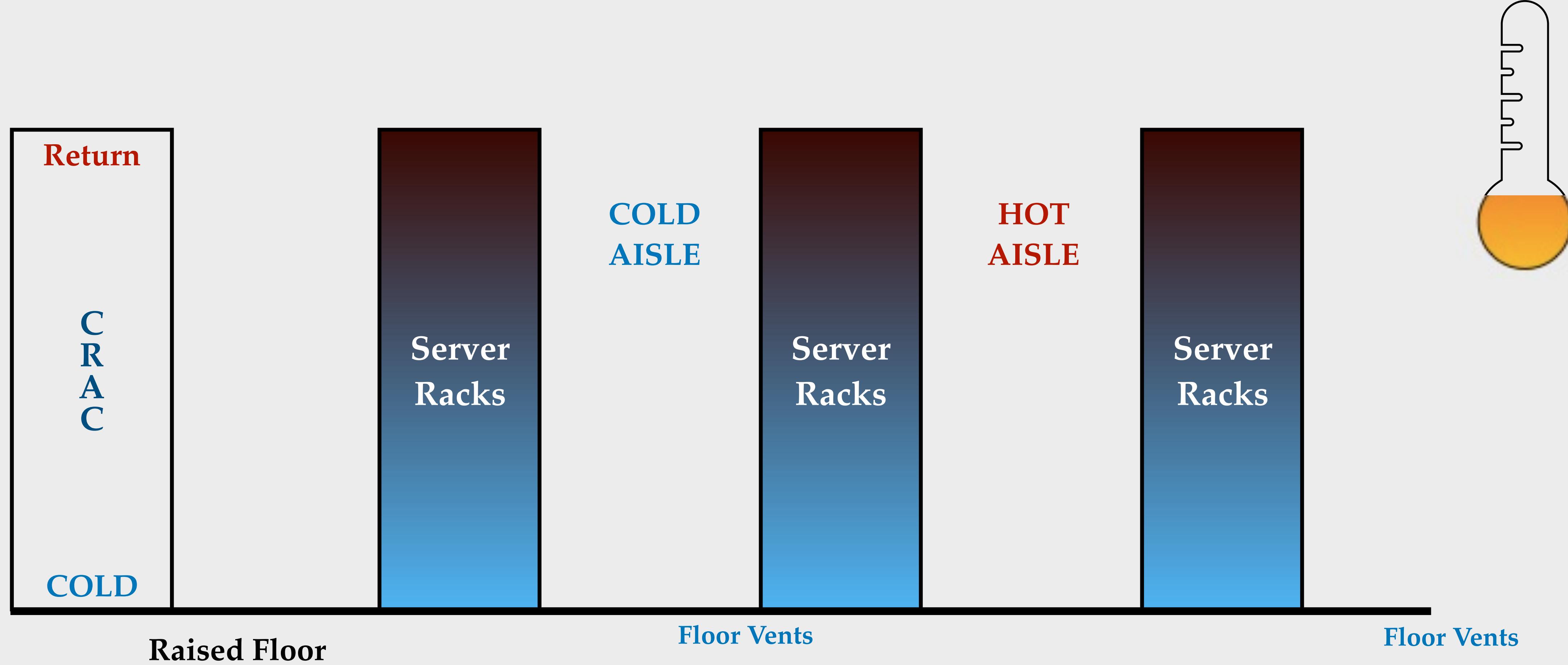


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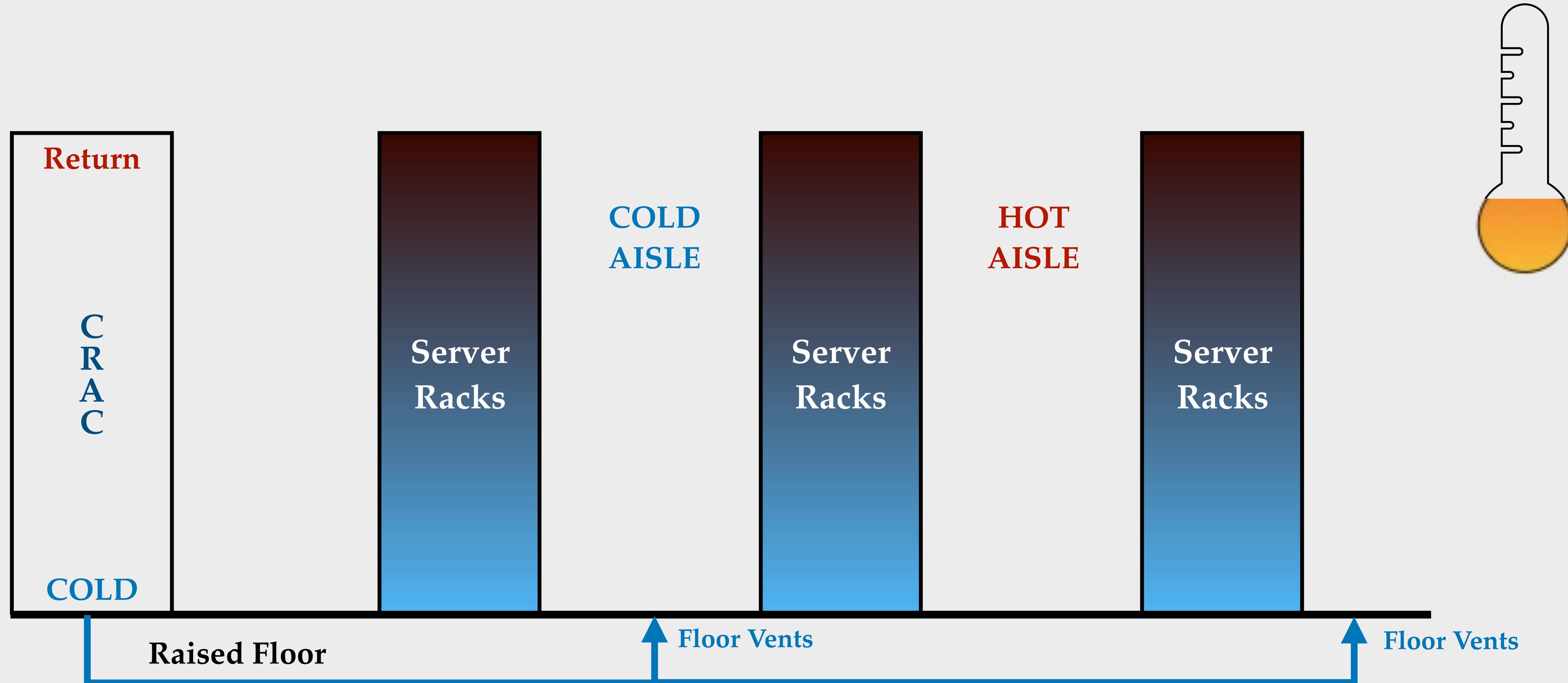
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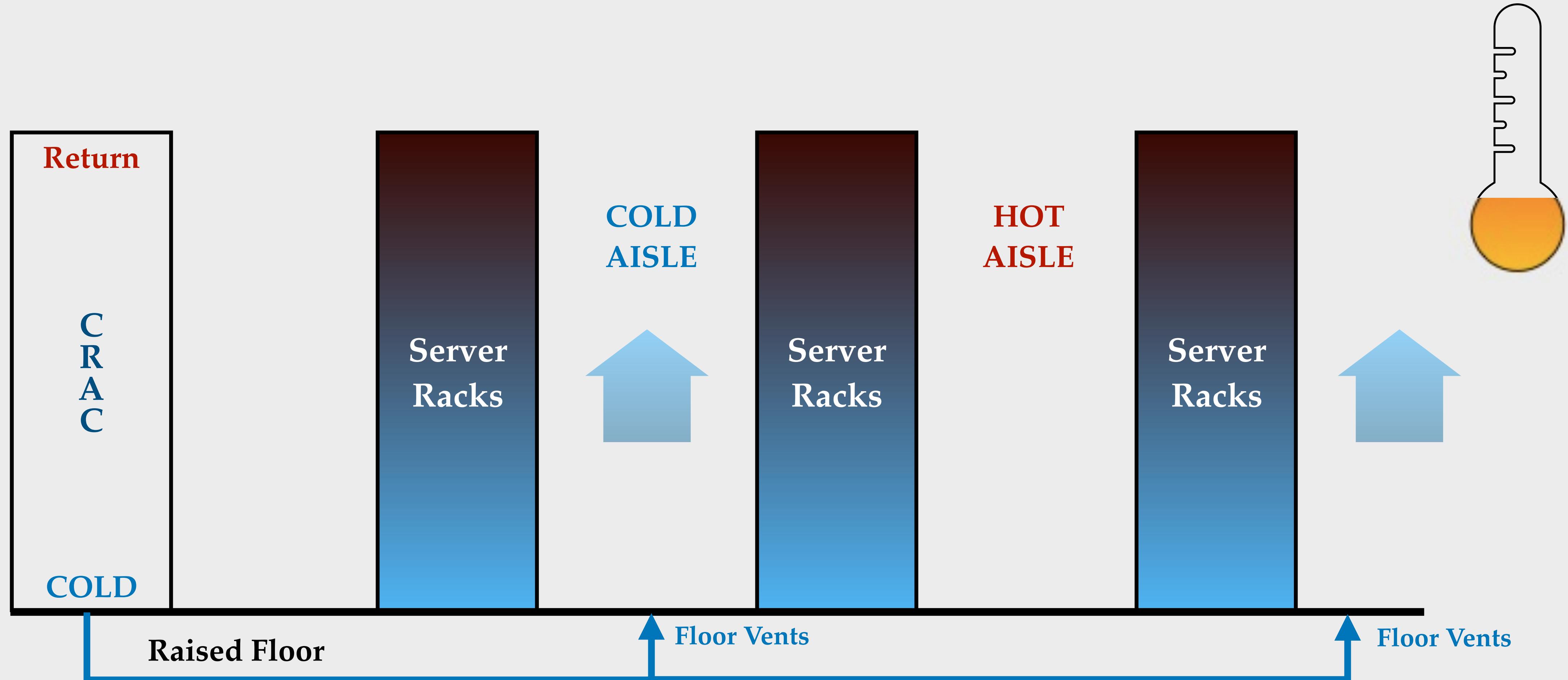
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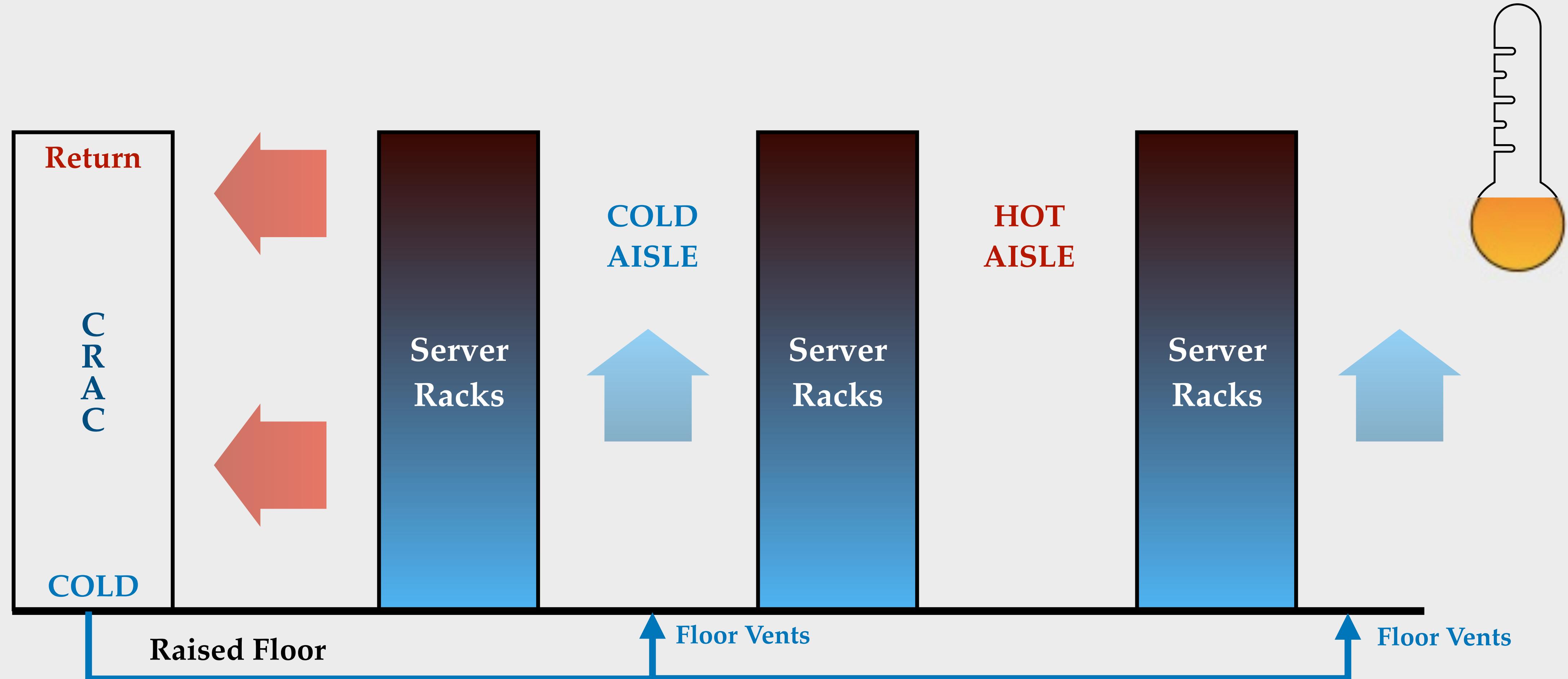
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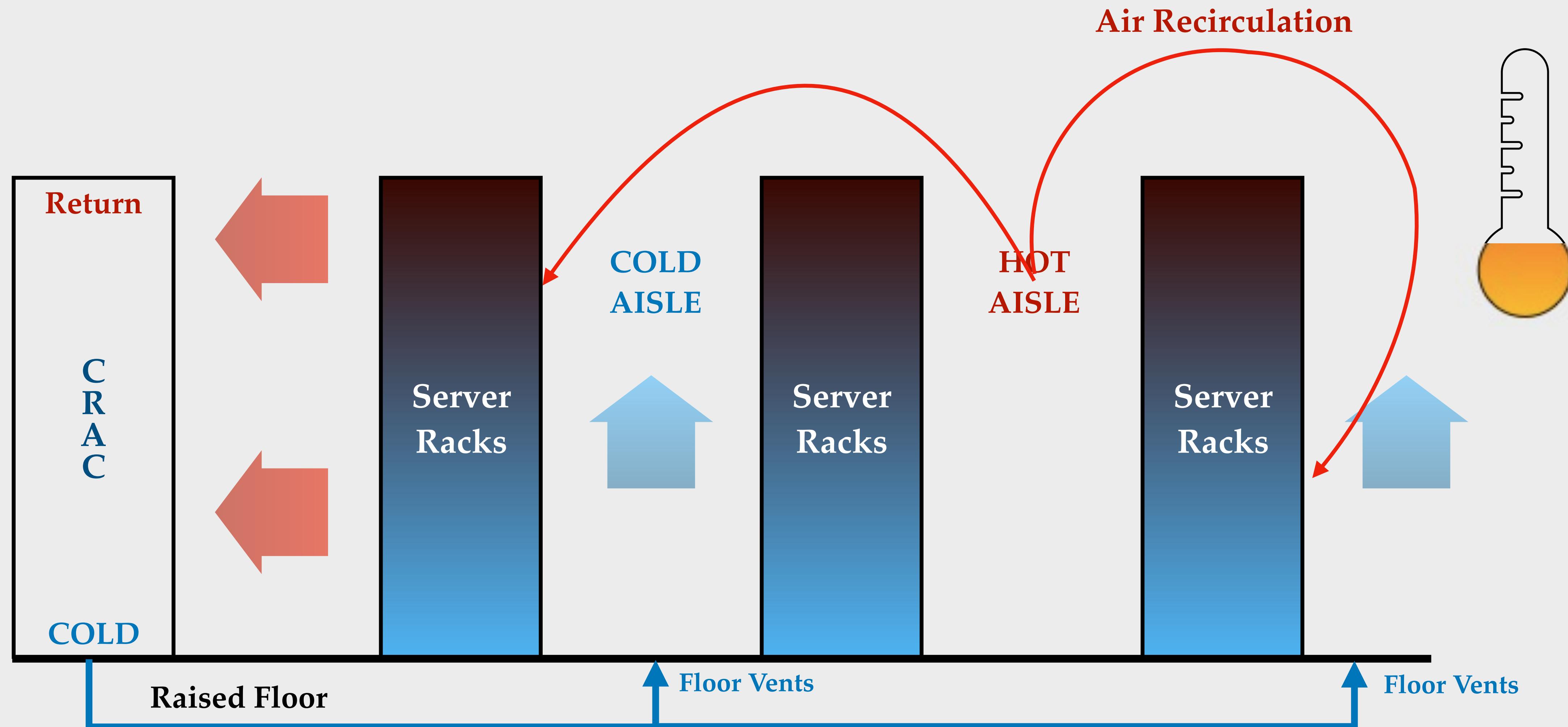
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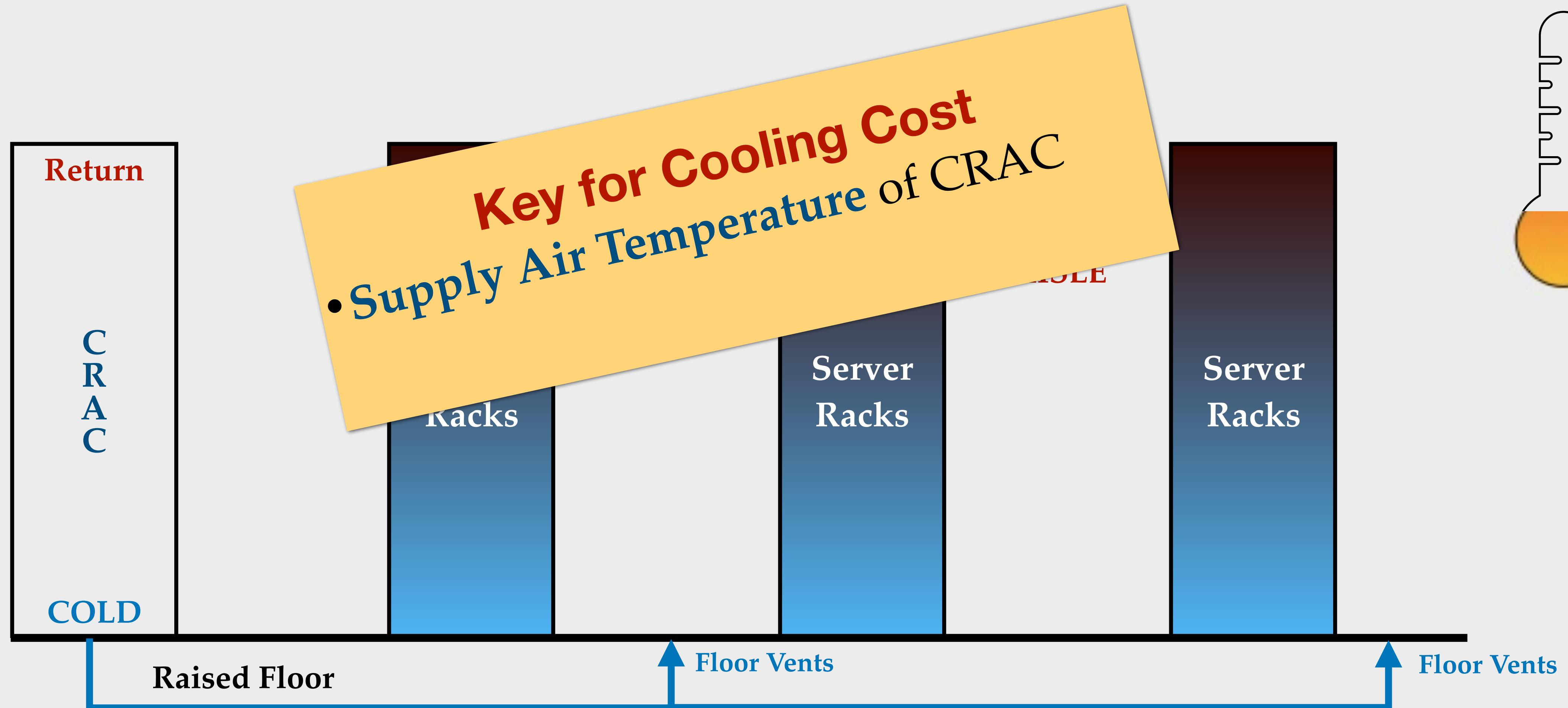
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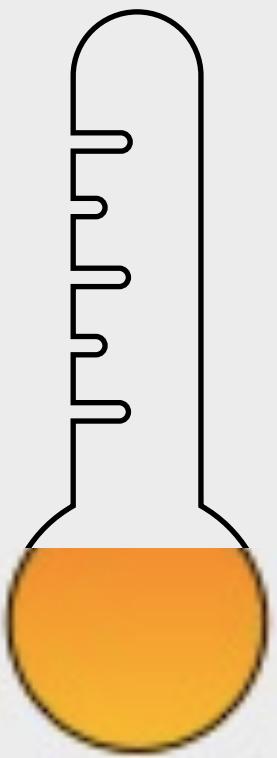
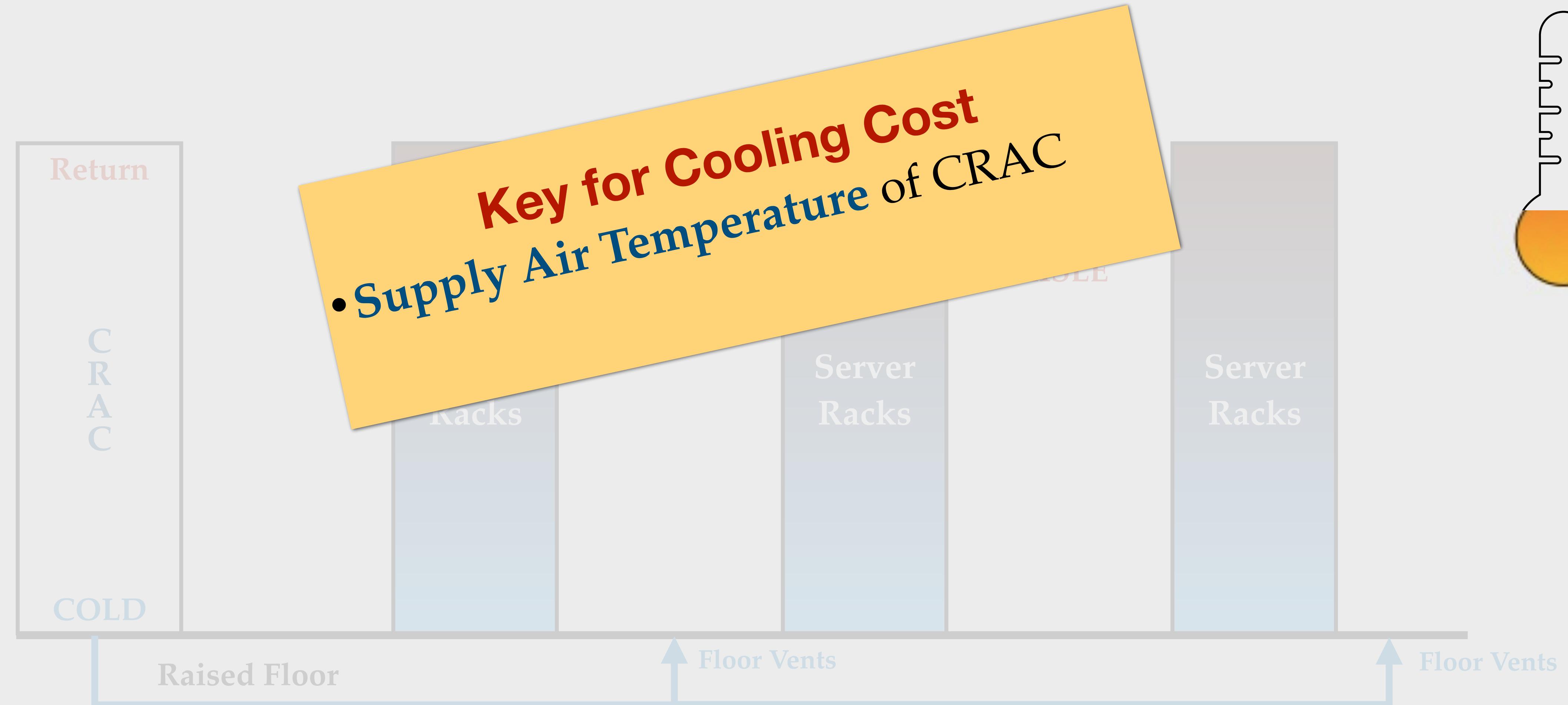
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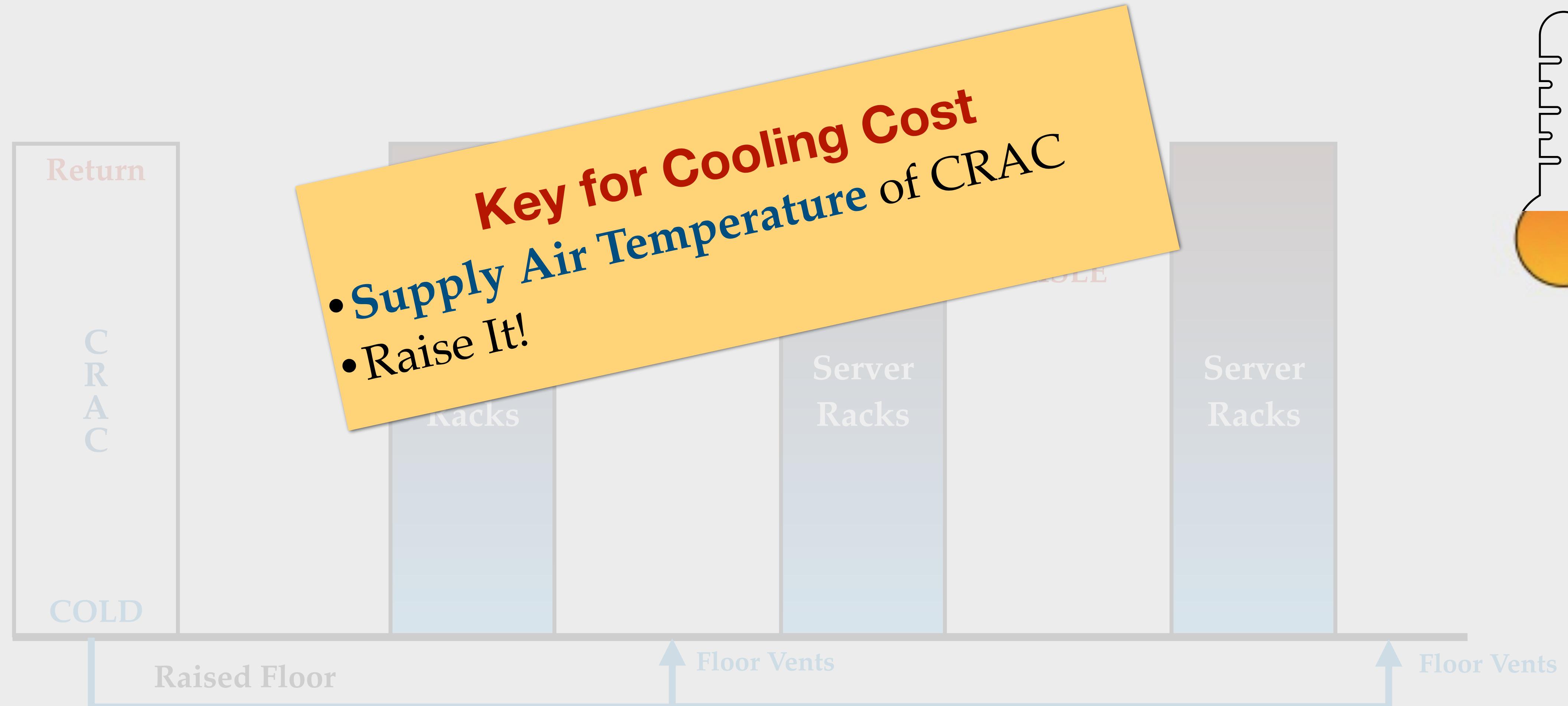
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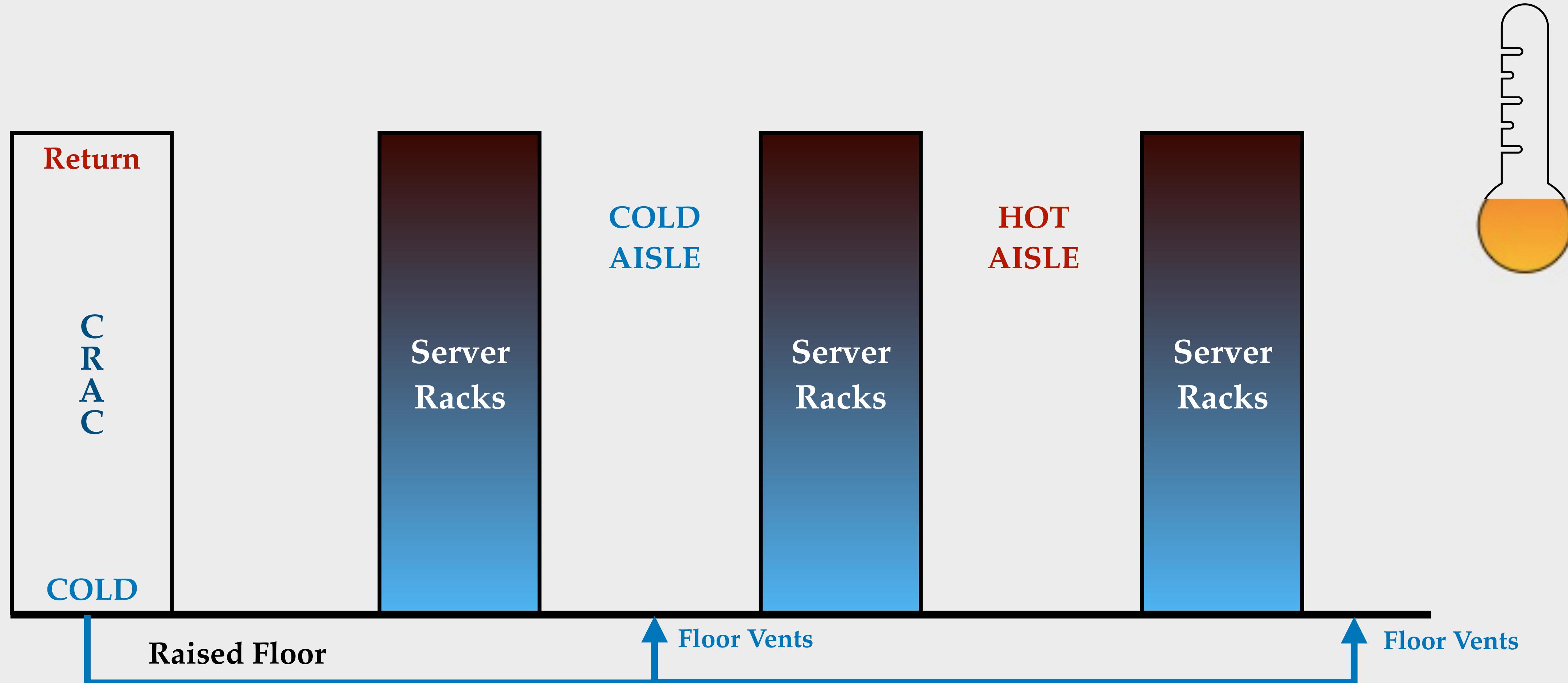
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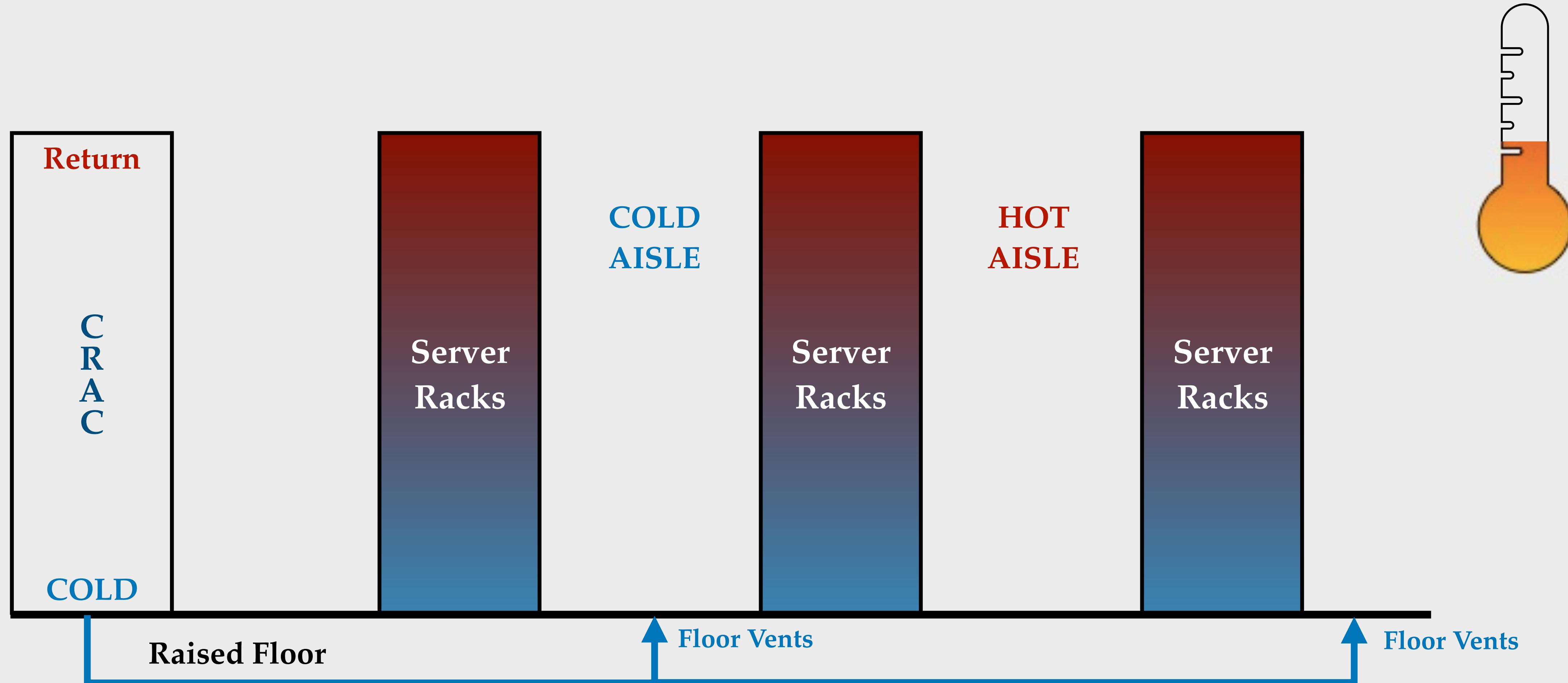
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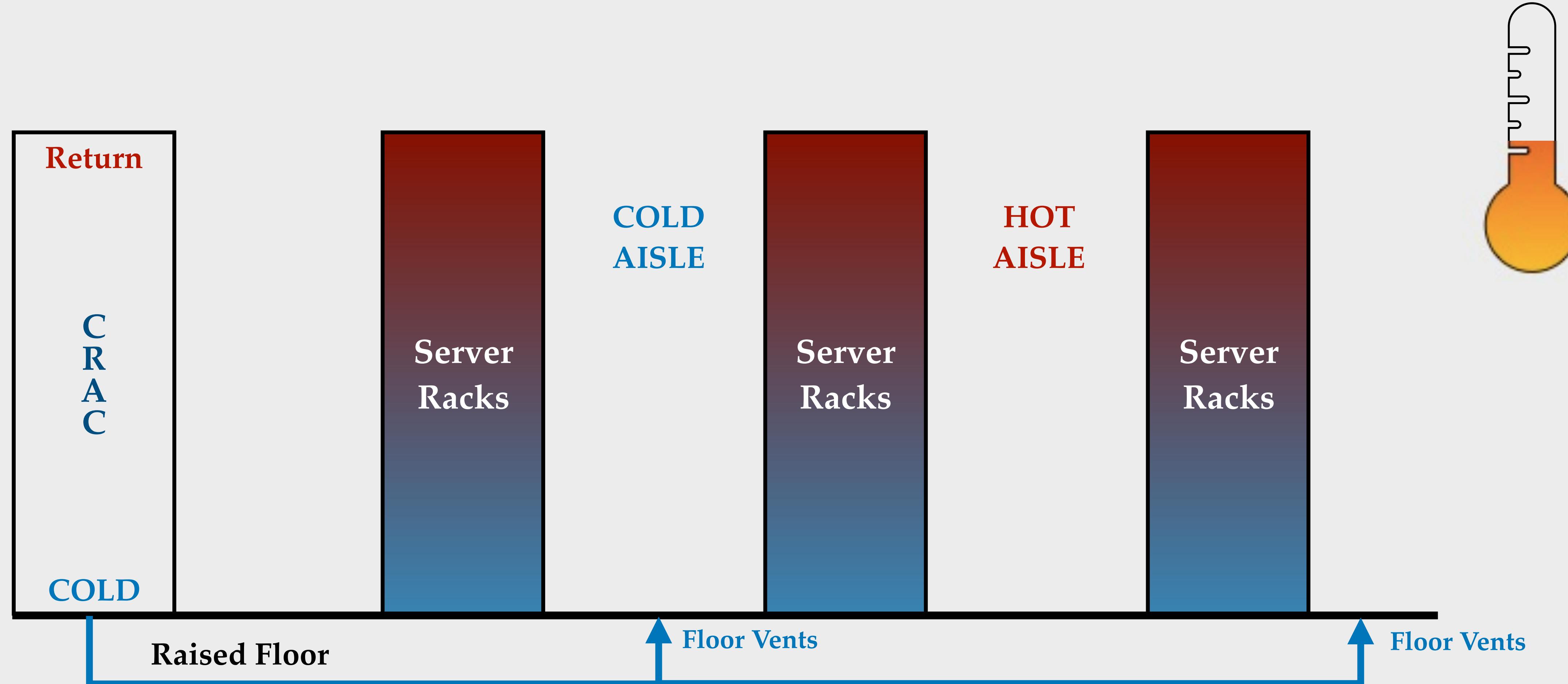
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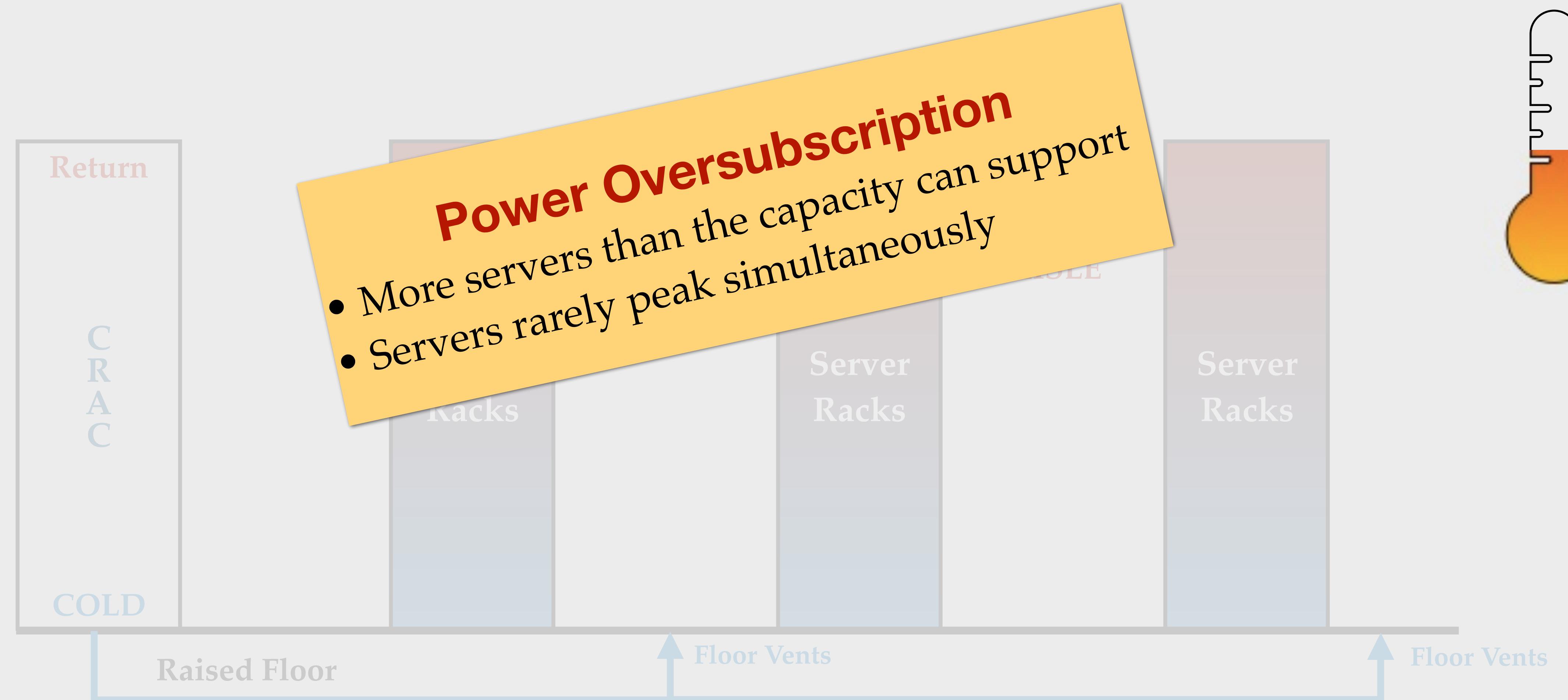
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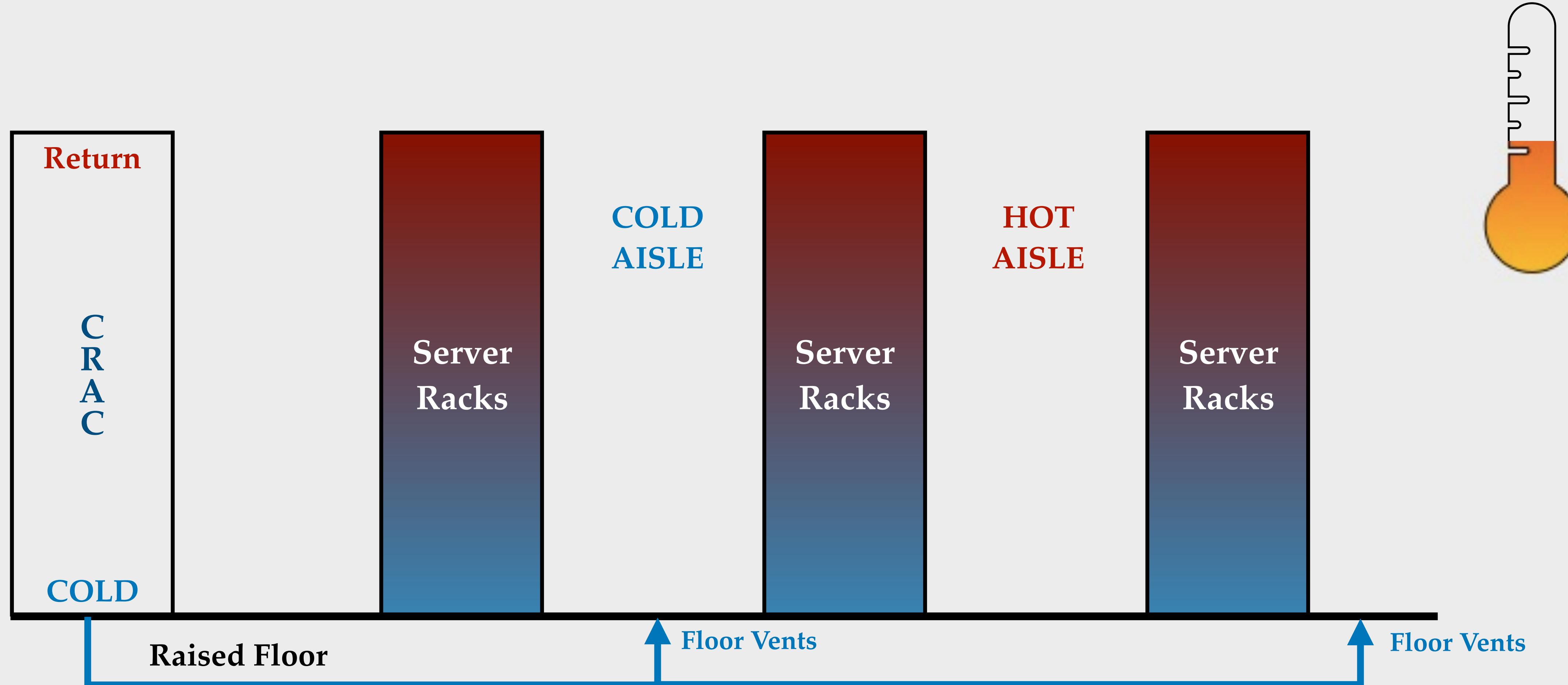
# Power Oversubscription



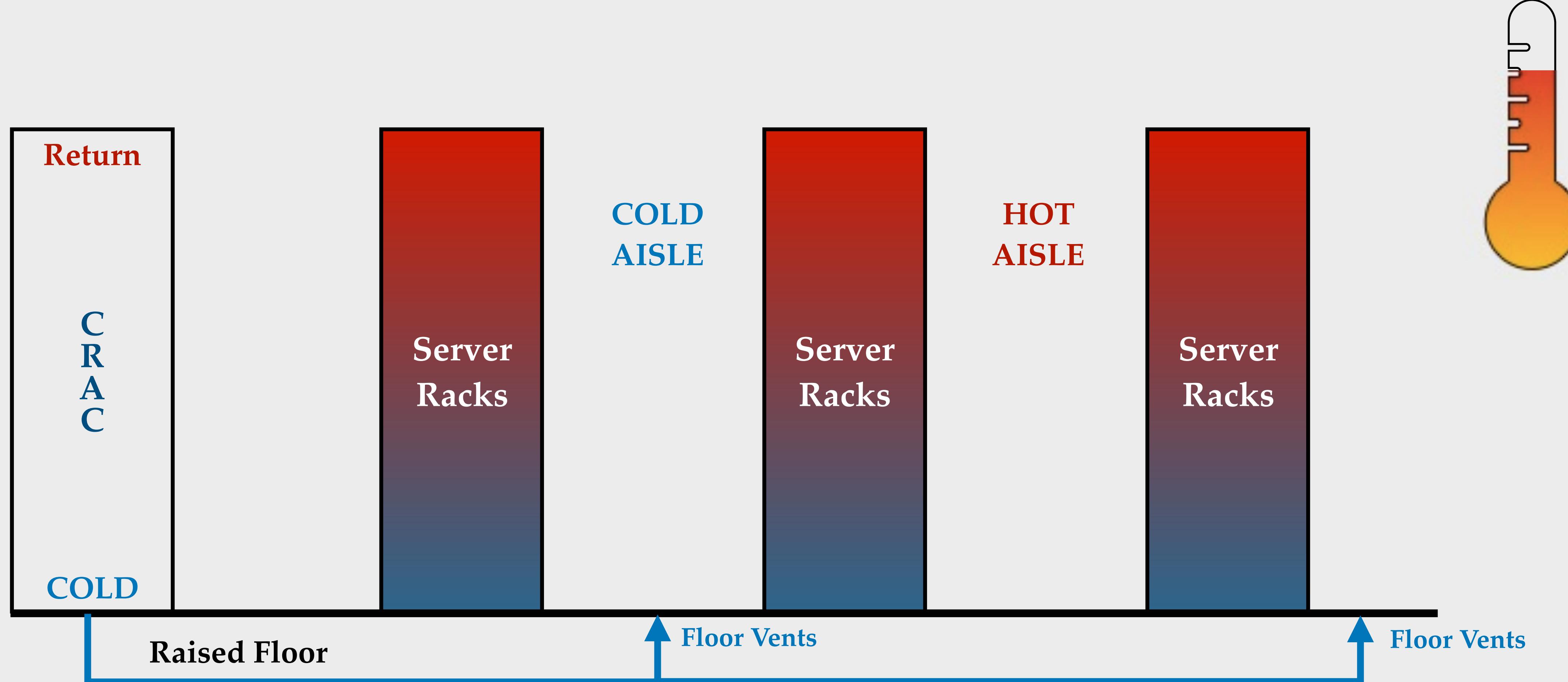
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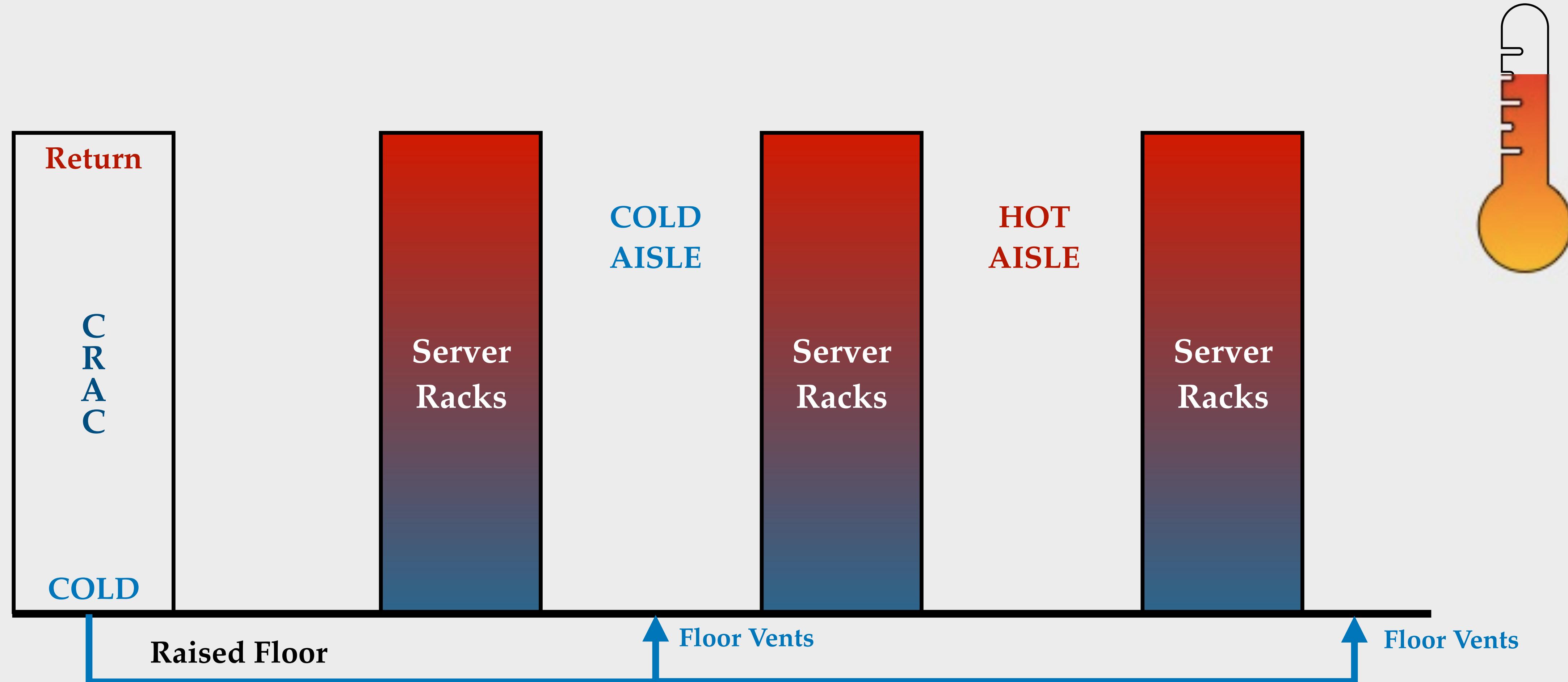
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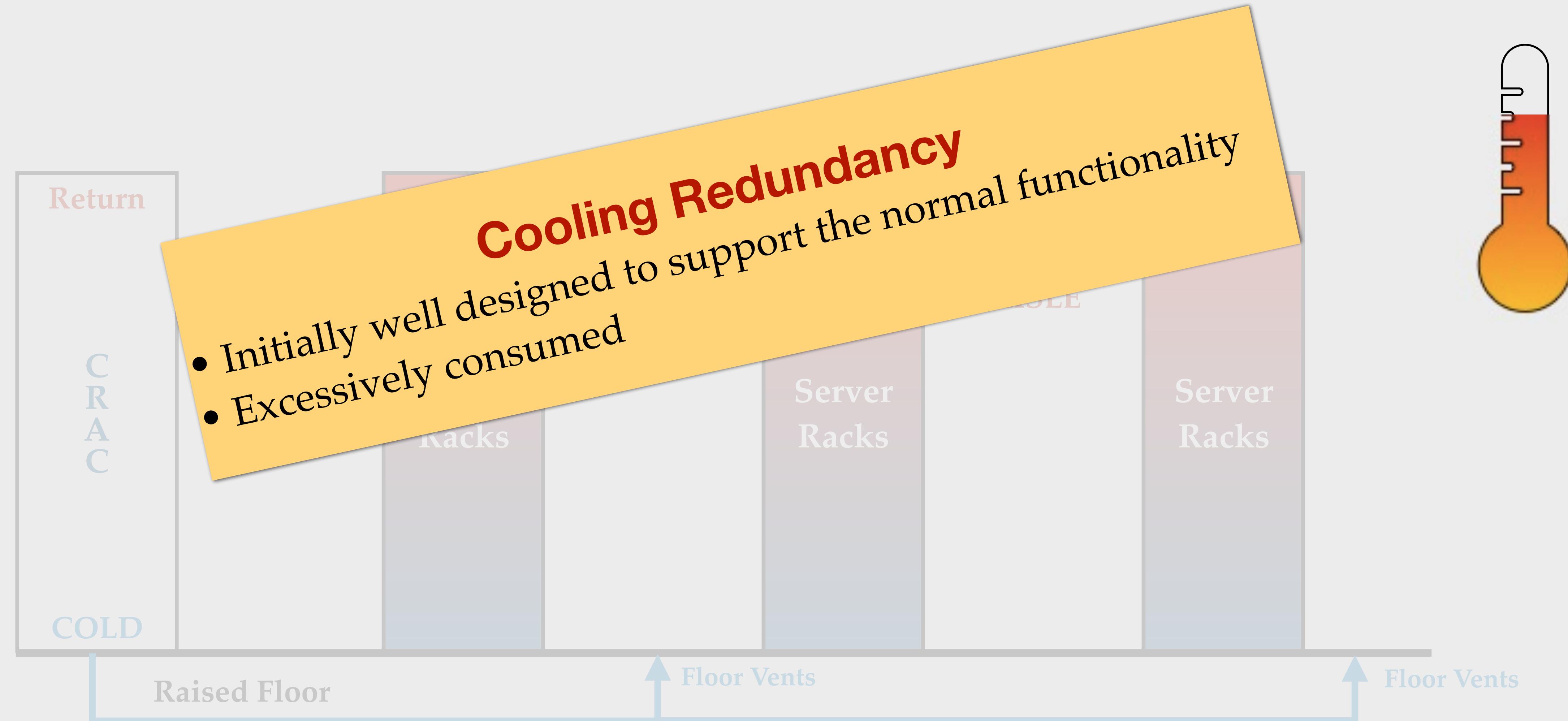
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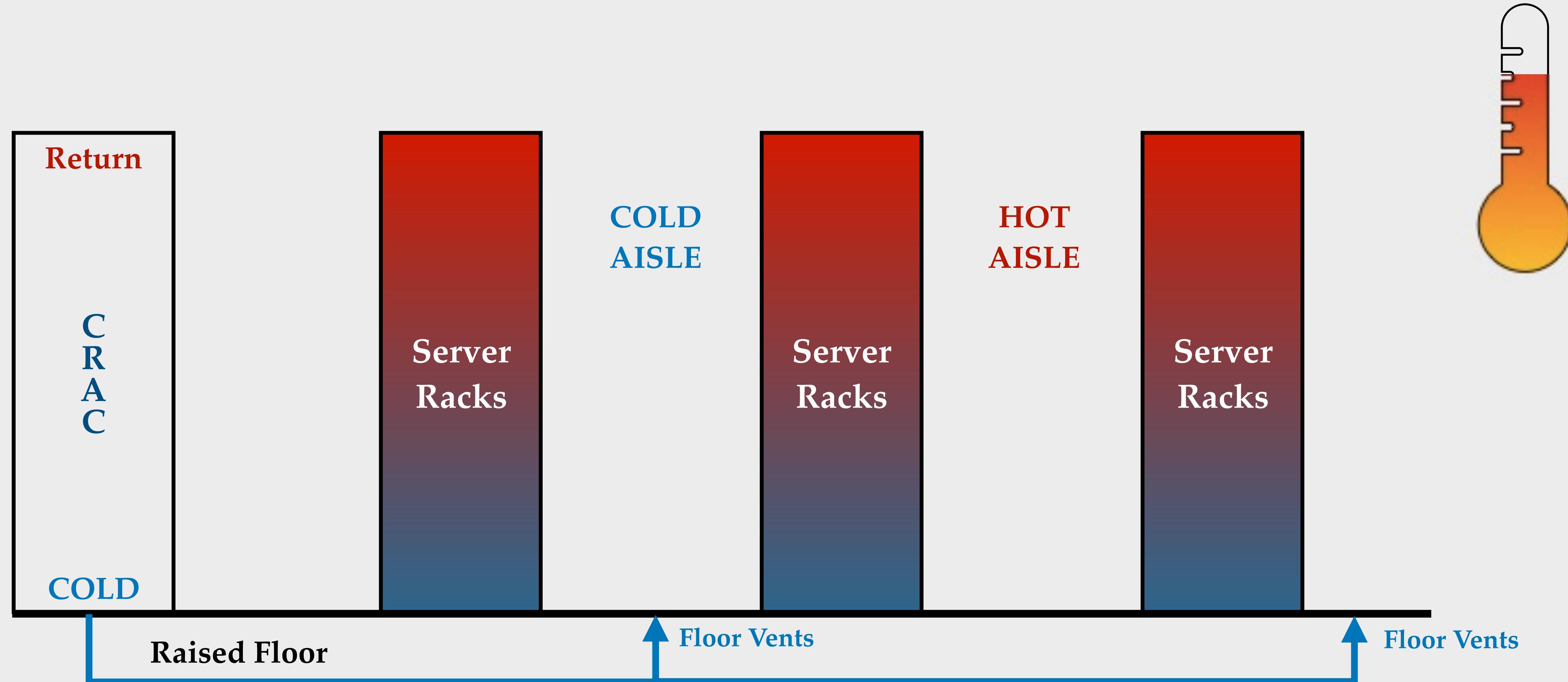
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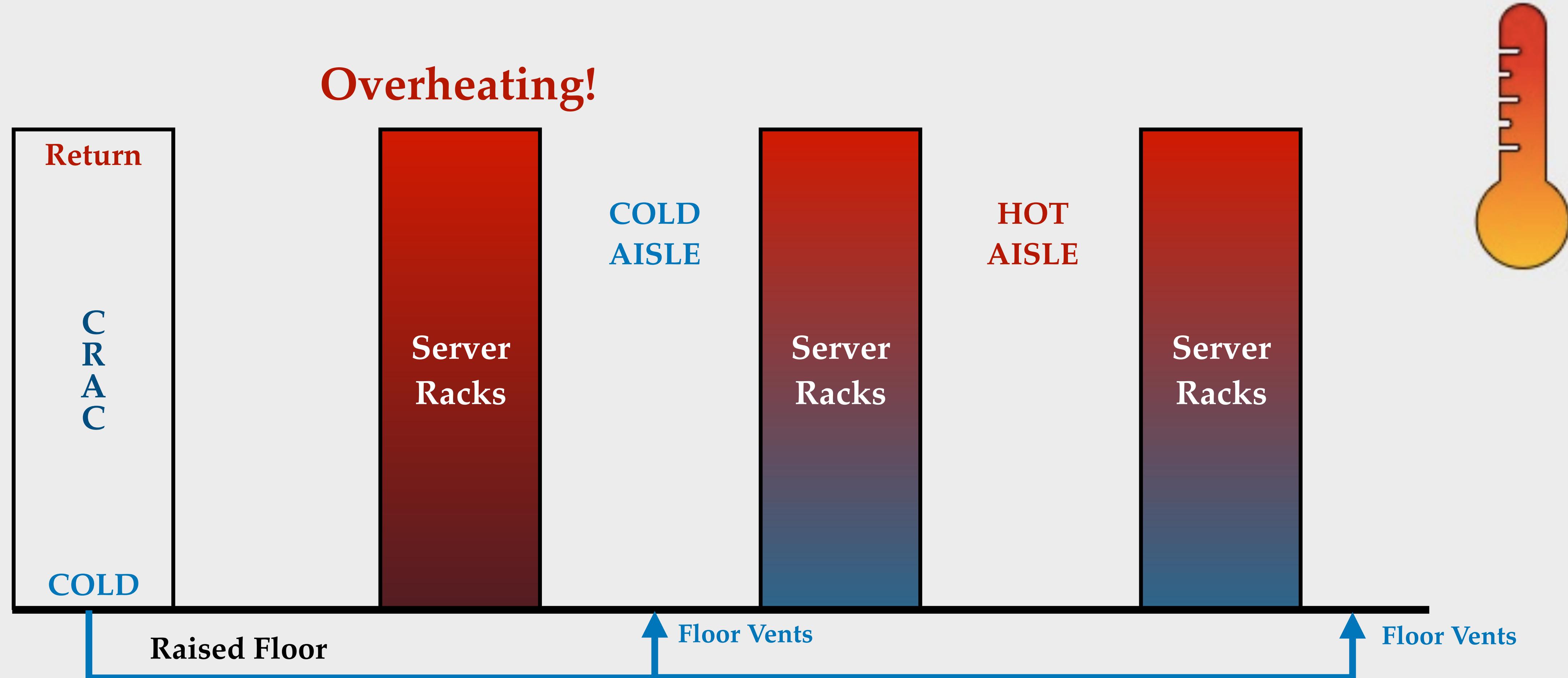
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# Overheating - Problems?



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- **Affect reliability**

- E.g., hardware failure
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$$\lambda_{EM} = A_0(J - J_{crit})^{-n} e^{(-E_a/kT)}$$

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Overheating brings down Microsoft data center

14 March 2013 | By Penny Jones

DESIGN > POWER AND COOLING

Heatwave, Cooling Failure Bring iiNet Data Center Down in Perth

MANAGE > UPTIME

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Rich Miller | Mar 25, 2010

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  - Air recirculation
  - Gaps between insulation
- **Raise cooling cost**
- **Cooling failure**
  - Server shutdown!

## Potential Threats:

- Intentionally cause overheating?

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$$- J_{crit})^{-n} e^{(-E_a/kT)}$$

MANAGE > UPTIME

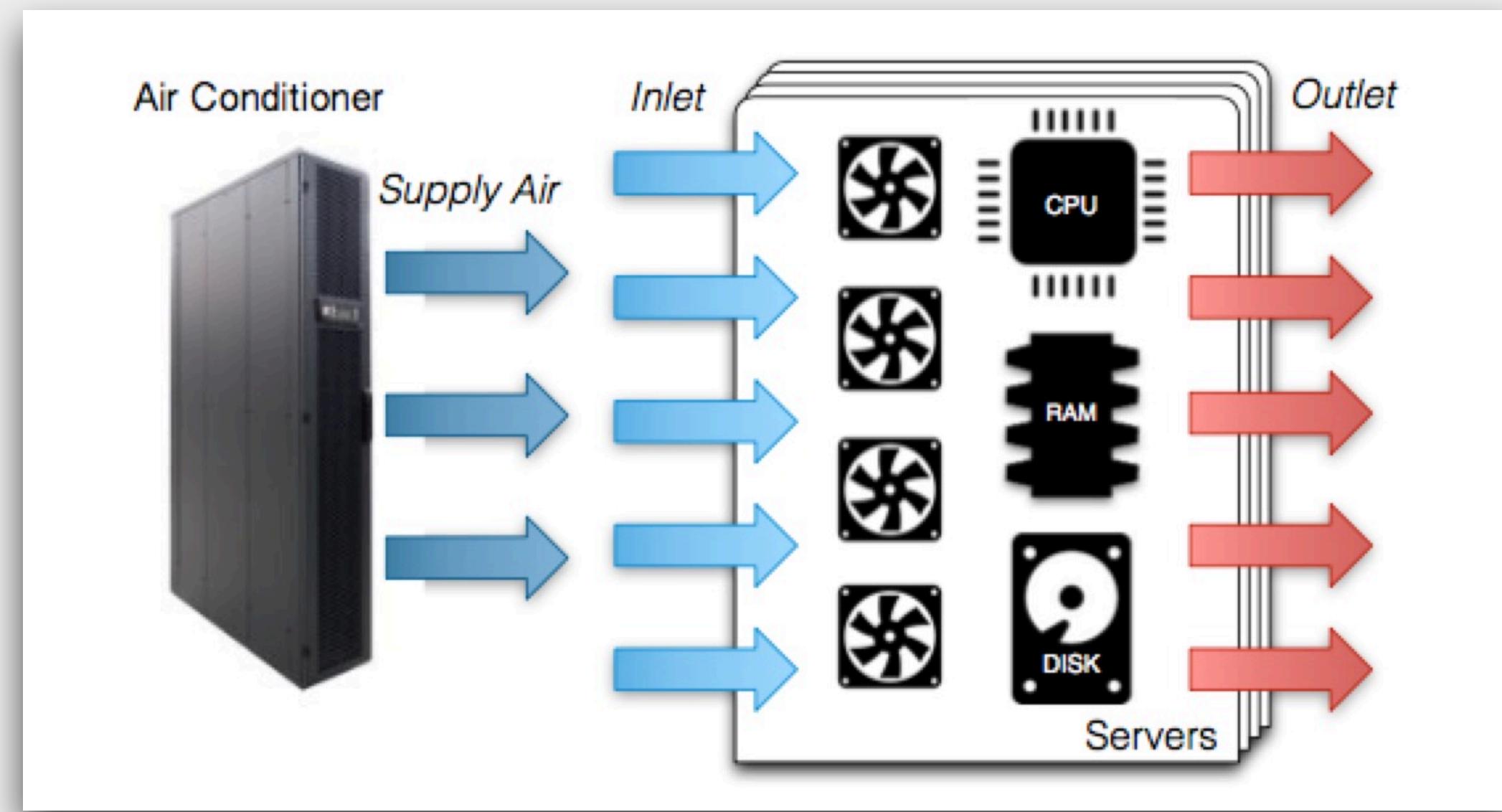
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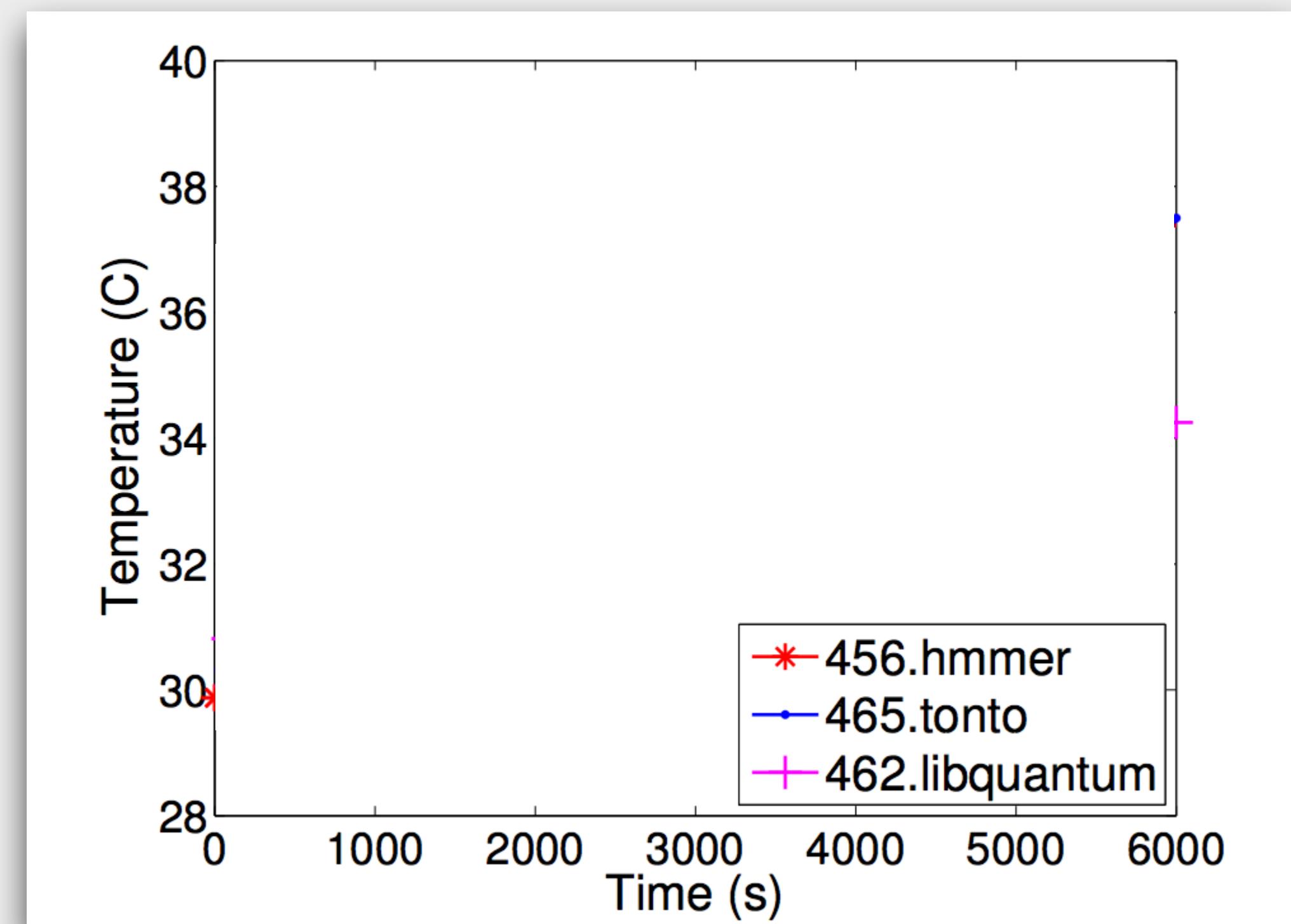
# Testbed Measurement Setup

- Sealed Environment
- Supermicro server
- “Go!Temp” temperature probe



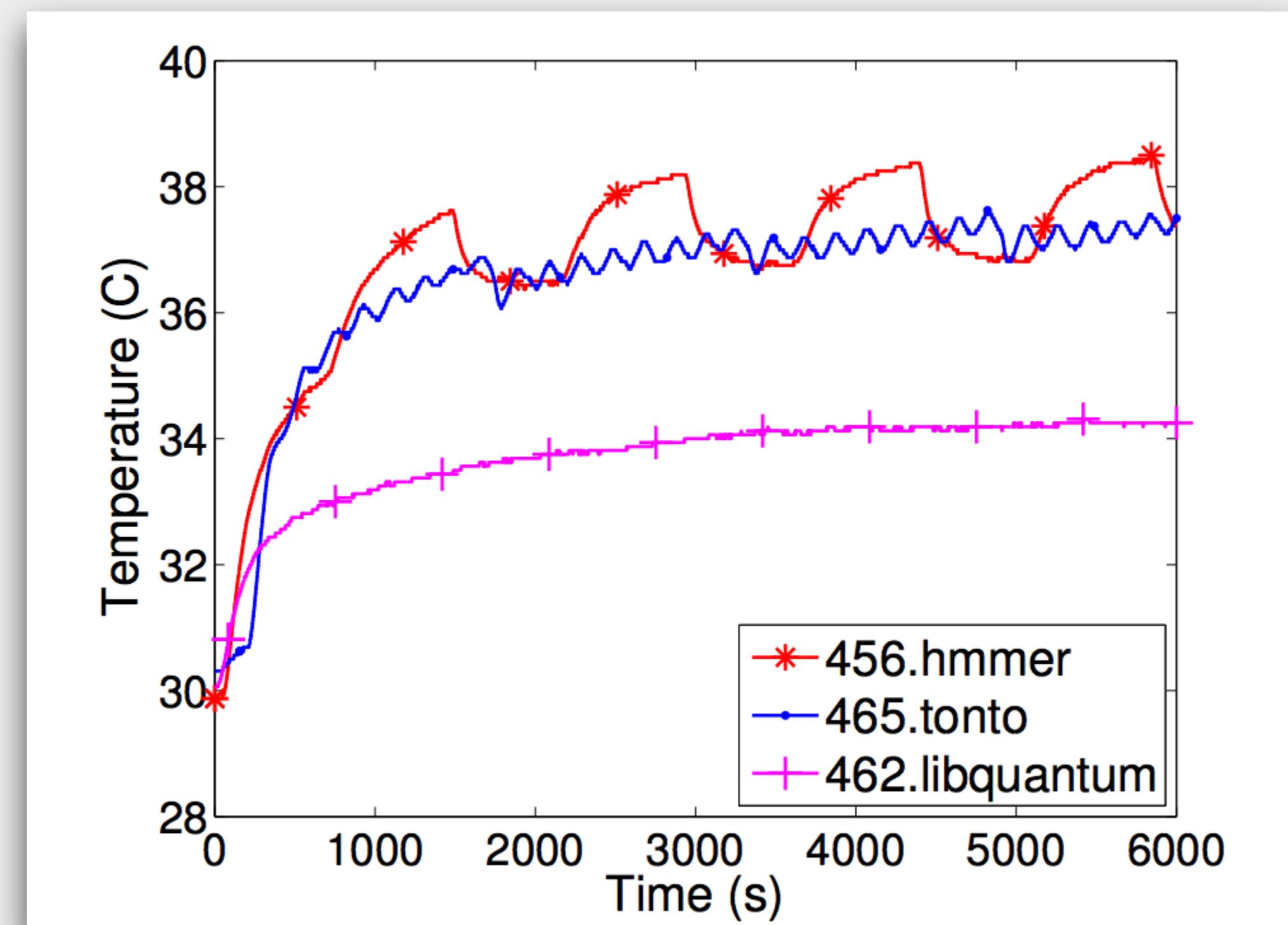
# Thermal Characteristics

Similar system resource consumption



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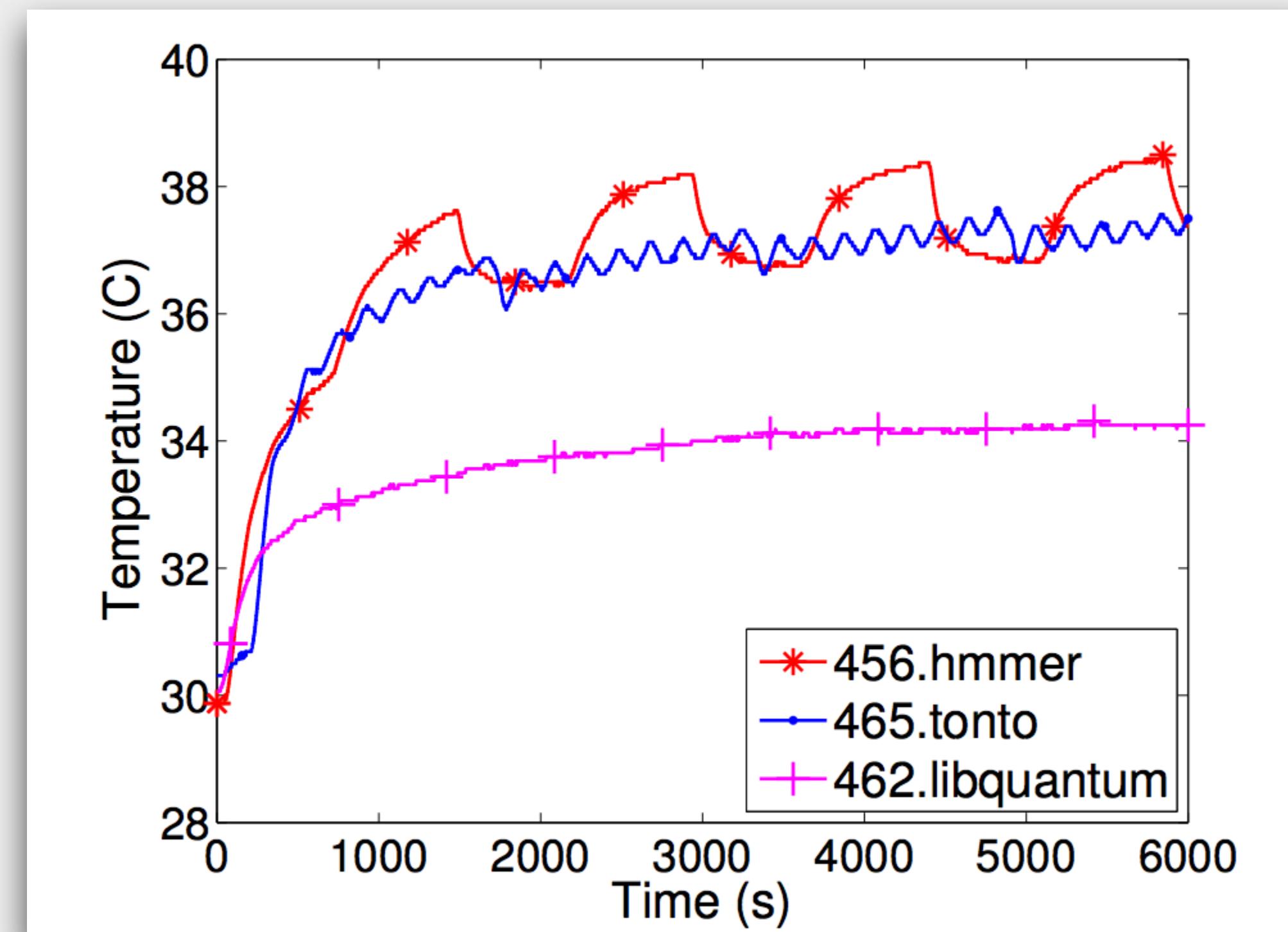
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# Thermal Characteristics

Similar system resource consumption

► leads to different outlet temperature.

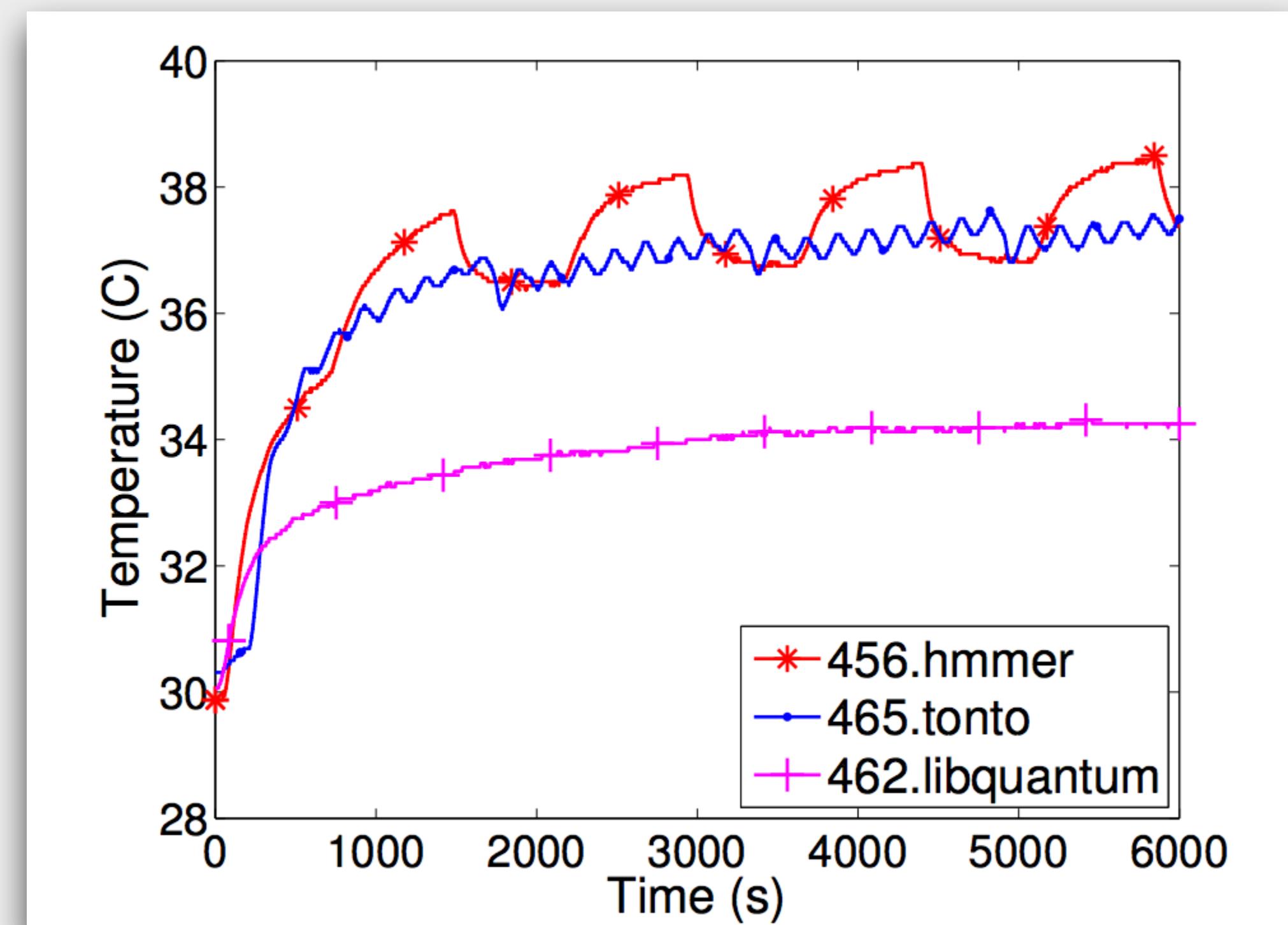


# Thermal Characteristics

Similar system resource consumption

- ▶ leads to different outlet temperature.

Reason: underlying pipeline flows are different  
Further cause CPU halt and leave function units idle



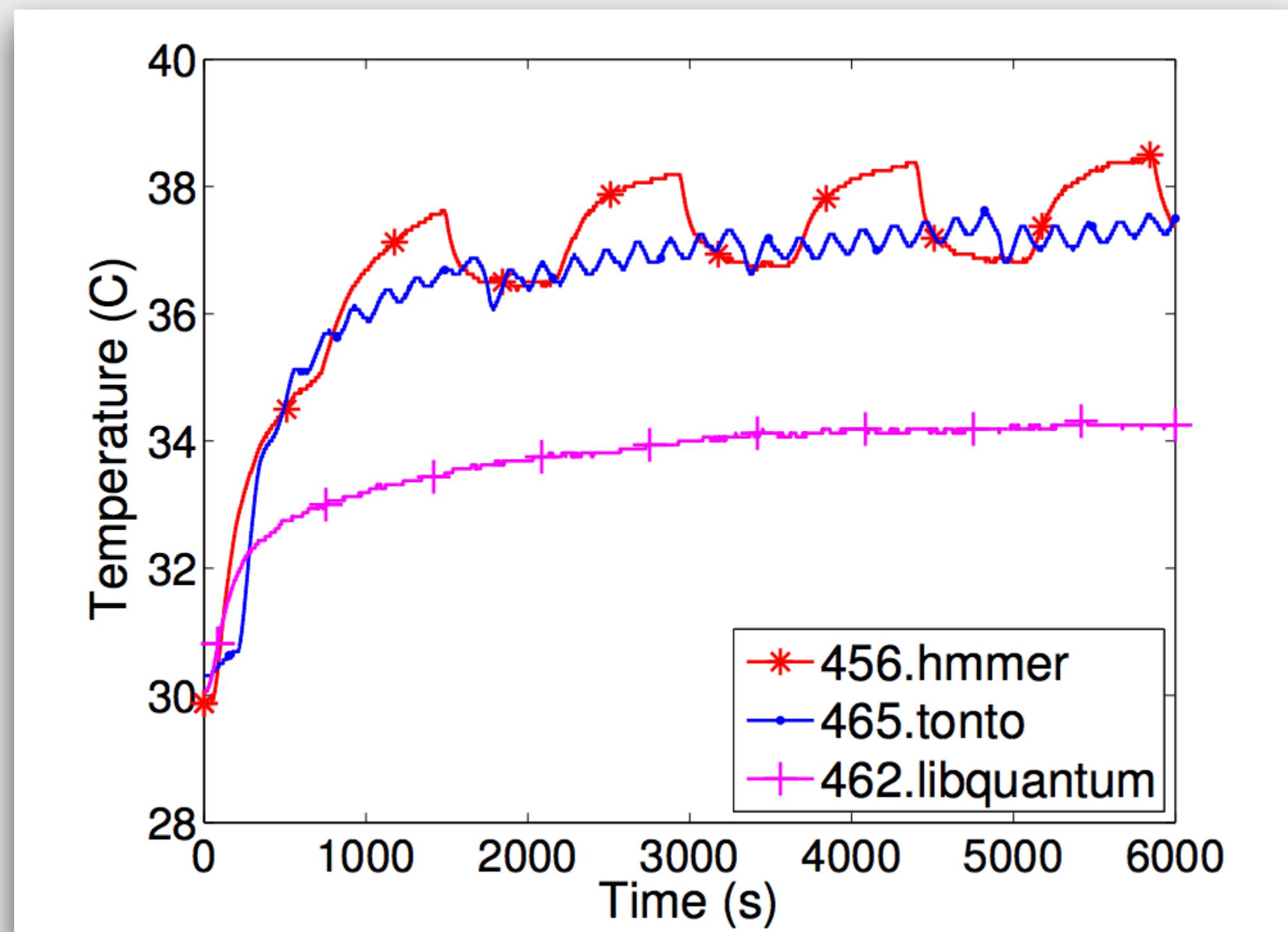
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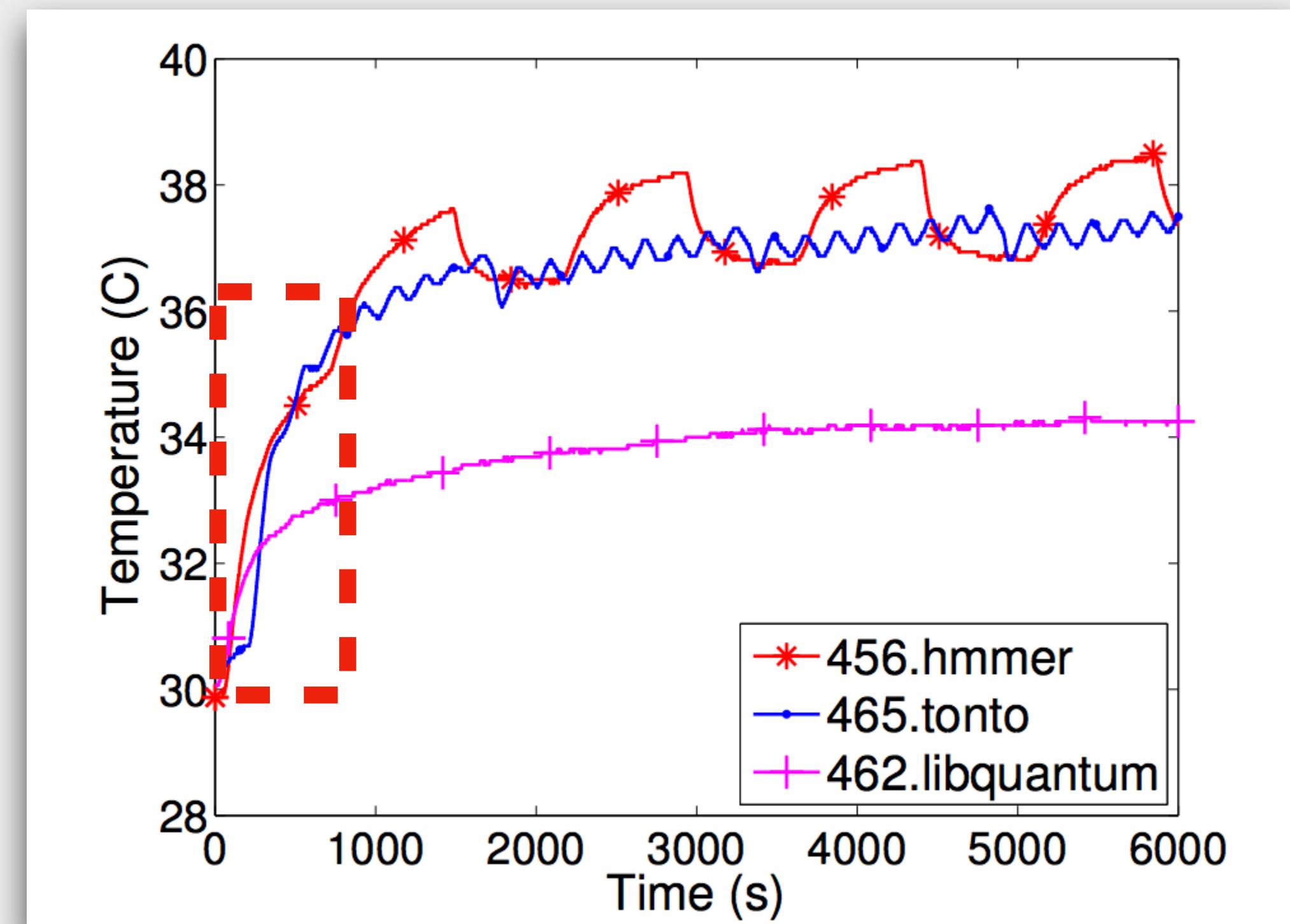
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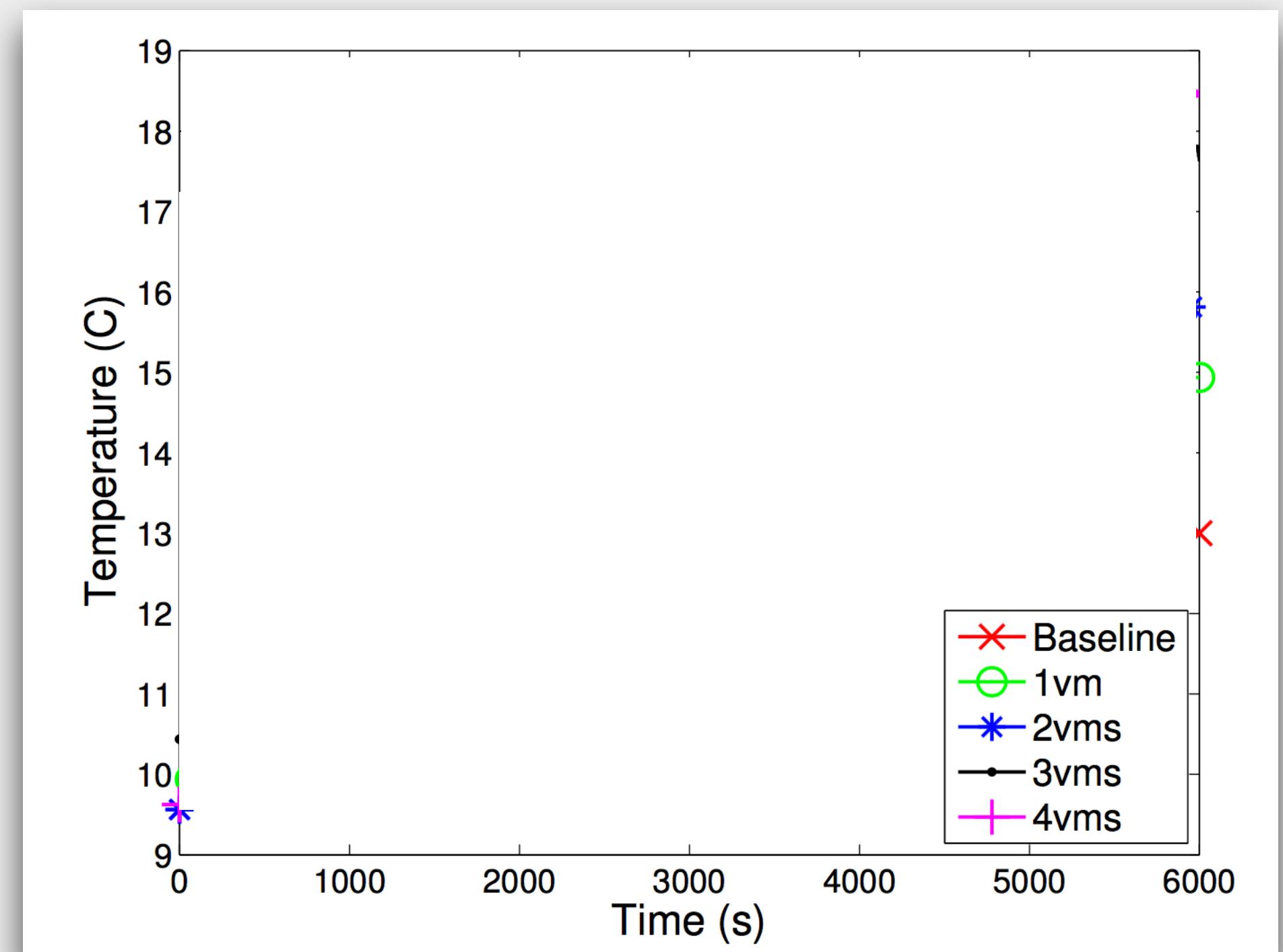
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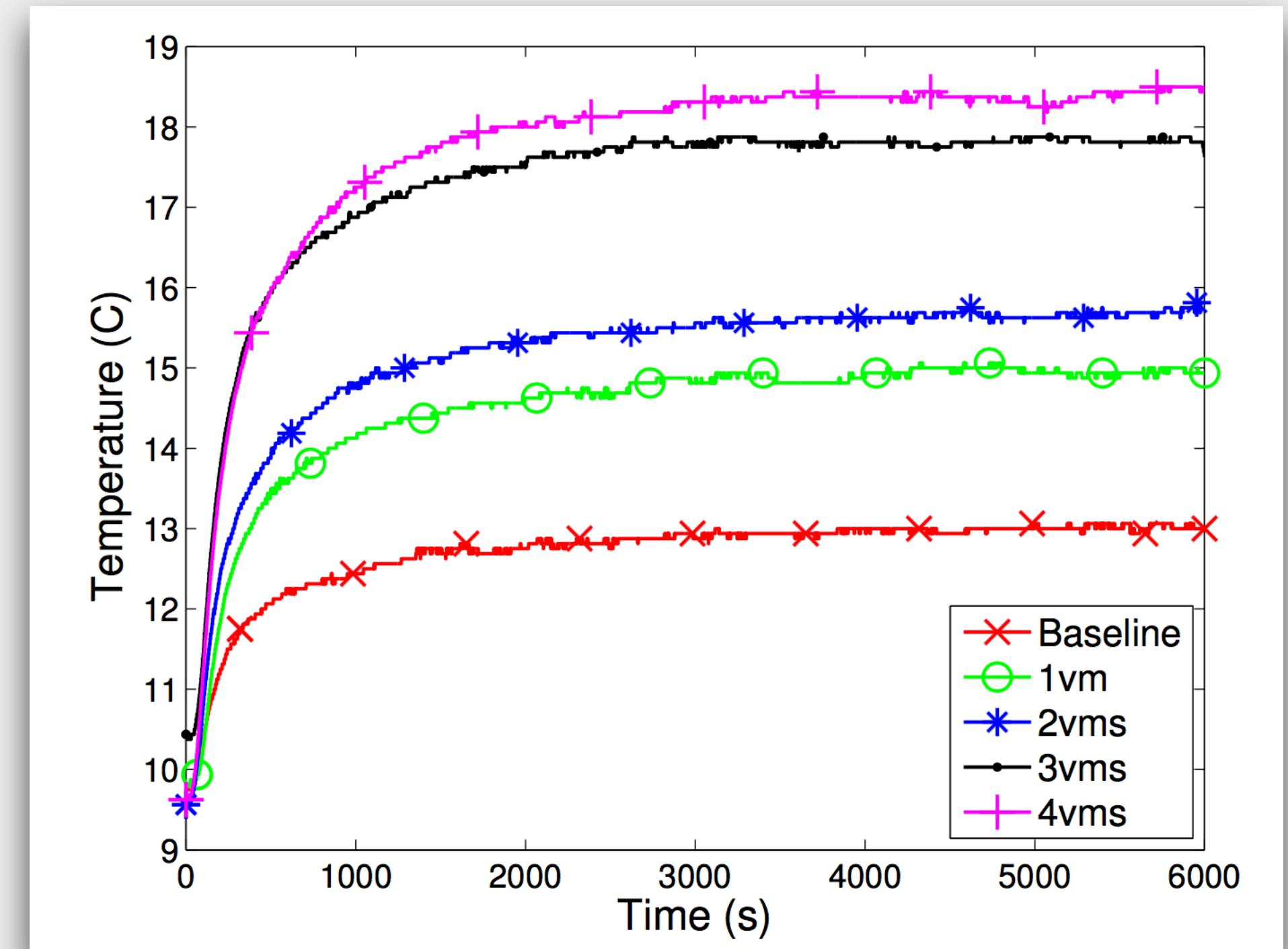
# Thermal Attacks on Virtual Machine

- Xen Hypervisor / VM with 4vCPU
- Baseline: 25% utilization



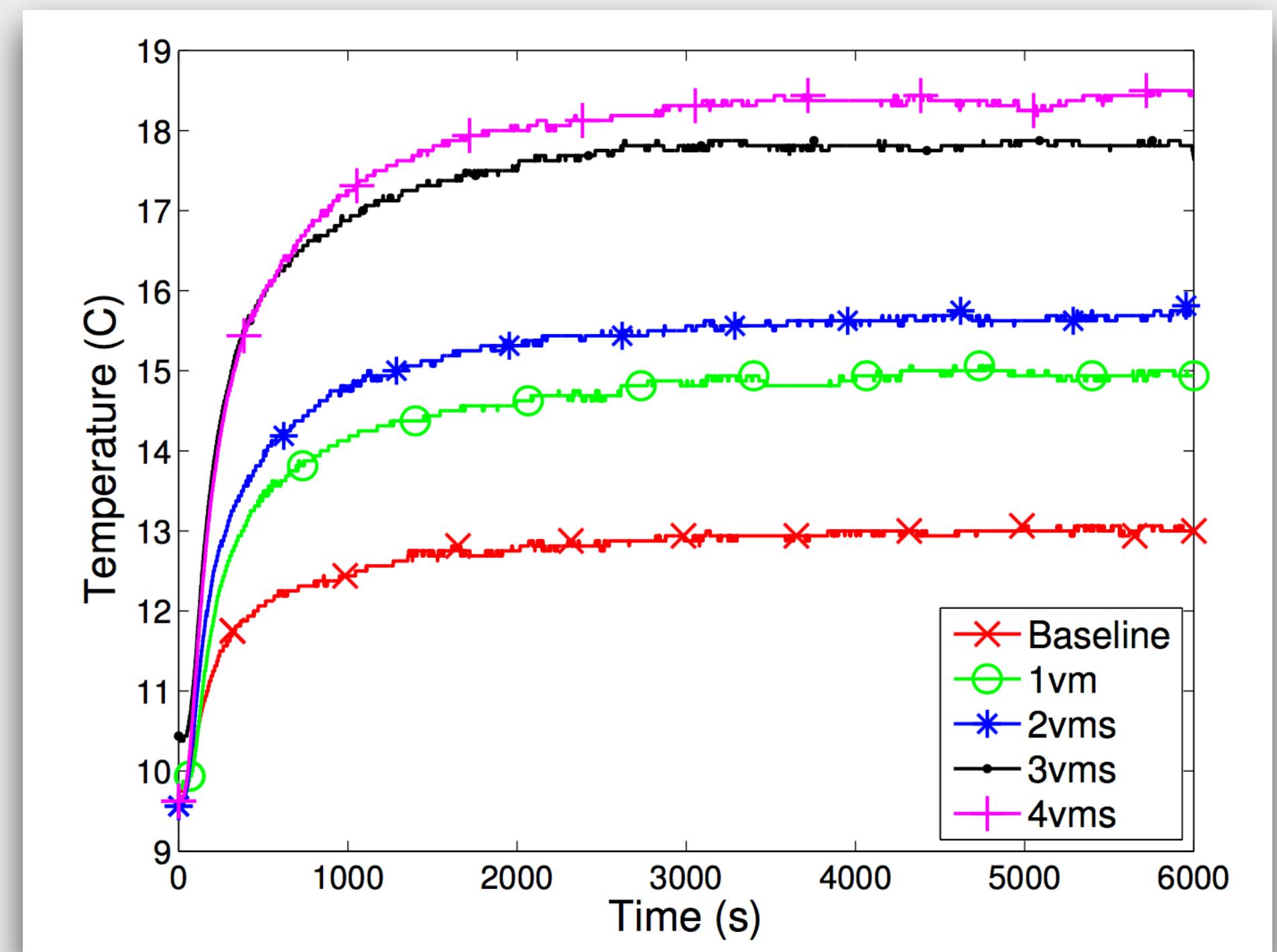
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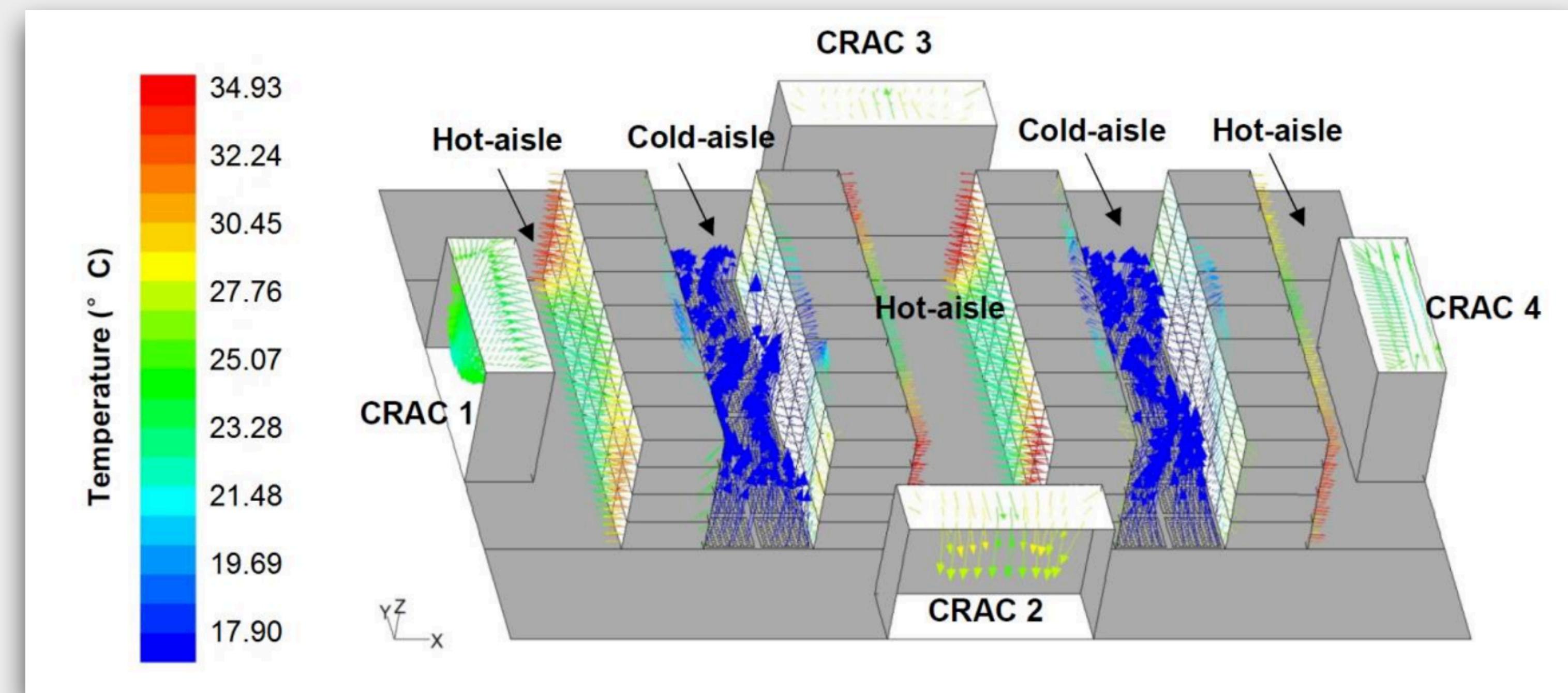
- Xen Hypervisor / VM with 4vCPU
- Baseline: 25% utilization
- Co-resident VMs can produce more heat



# Data Center Level Simulation

## **Data center level: trace-driven computational fluid dynamics analysis.**

- CFD package, Fluent, to simulate the thermal environment.
  - Air recirculation.
  - Air density.
  - Air flow rate.

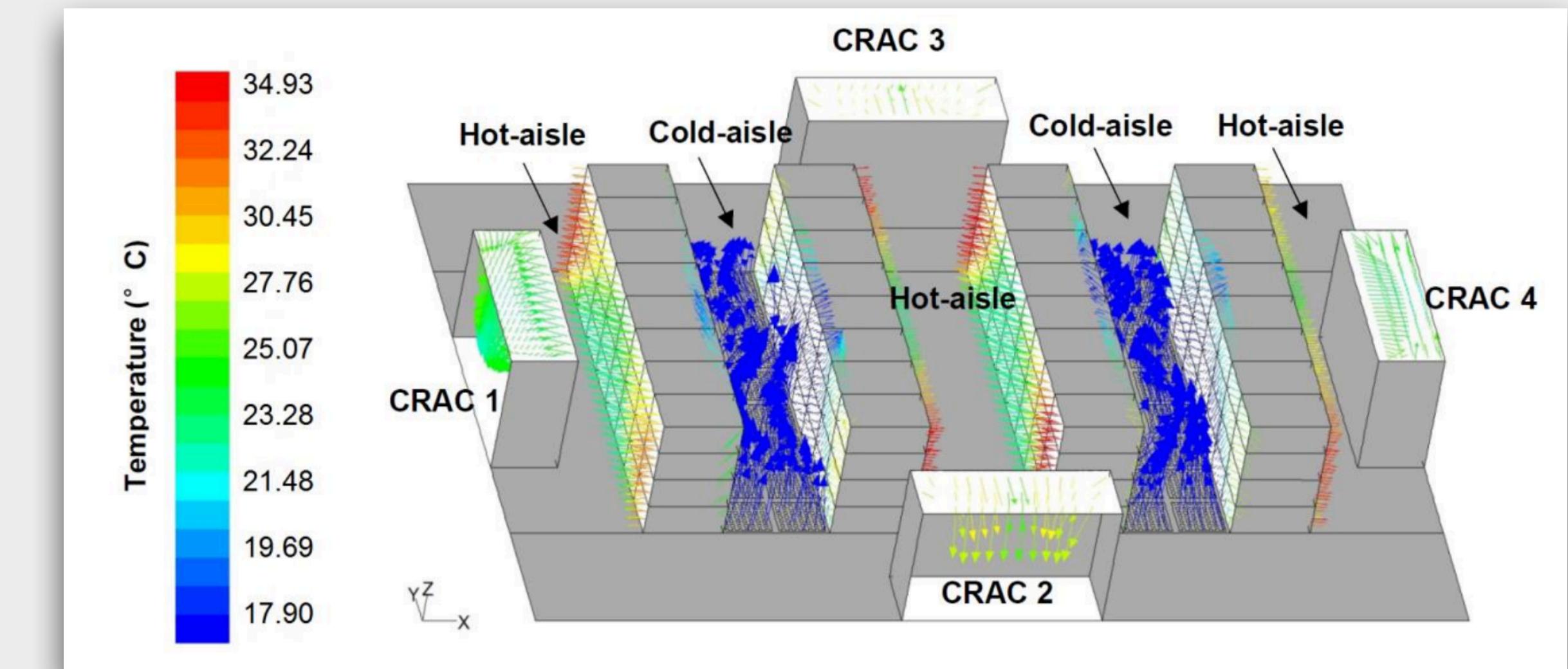


# Data Center Level Simulation

## Data center level: trace-driven computational fluid dynamics analysis.

- The layout:
  - 4 rows of servers;
  - 8 racks in each row;
  - 40 servers per rack —> 1280 servers.

Power-oversubscribed

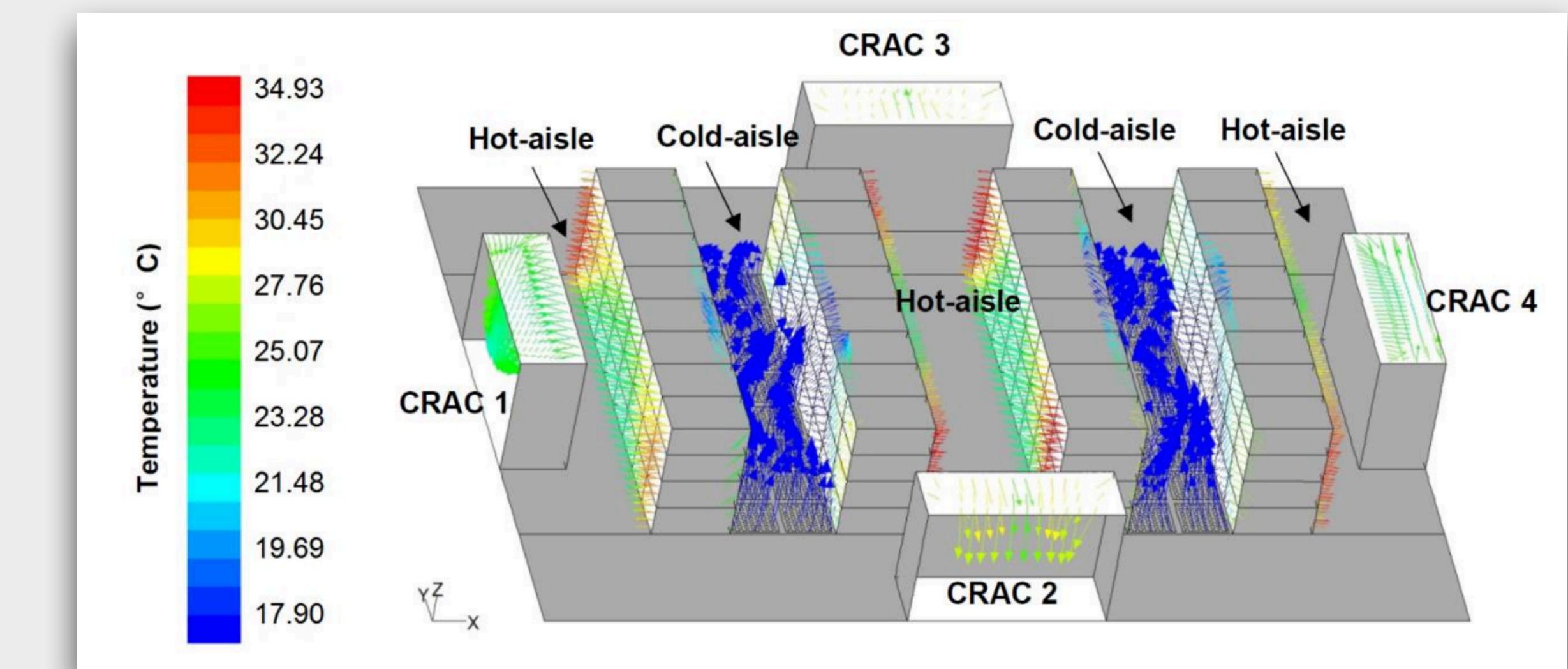


# Data Center Level Simulation

## Data center level: trace-driven computational fluid dynamics analysis.

- Toutlet is affected by outlet temperature, power consumption of all servers, and T<sub>sup</sub>.
- T<sub>inlet</sub> depends on T<sub>sup</sub> and Toutlet
- One-week trace from real data centers.

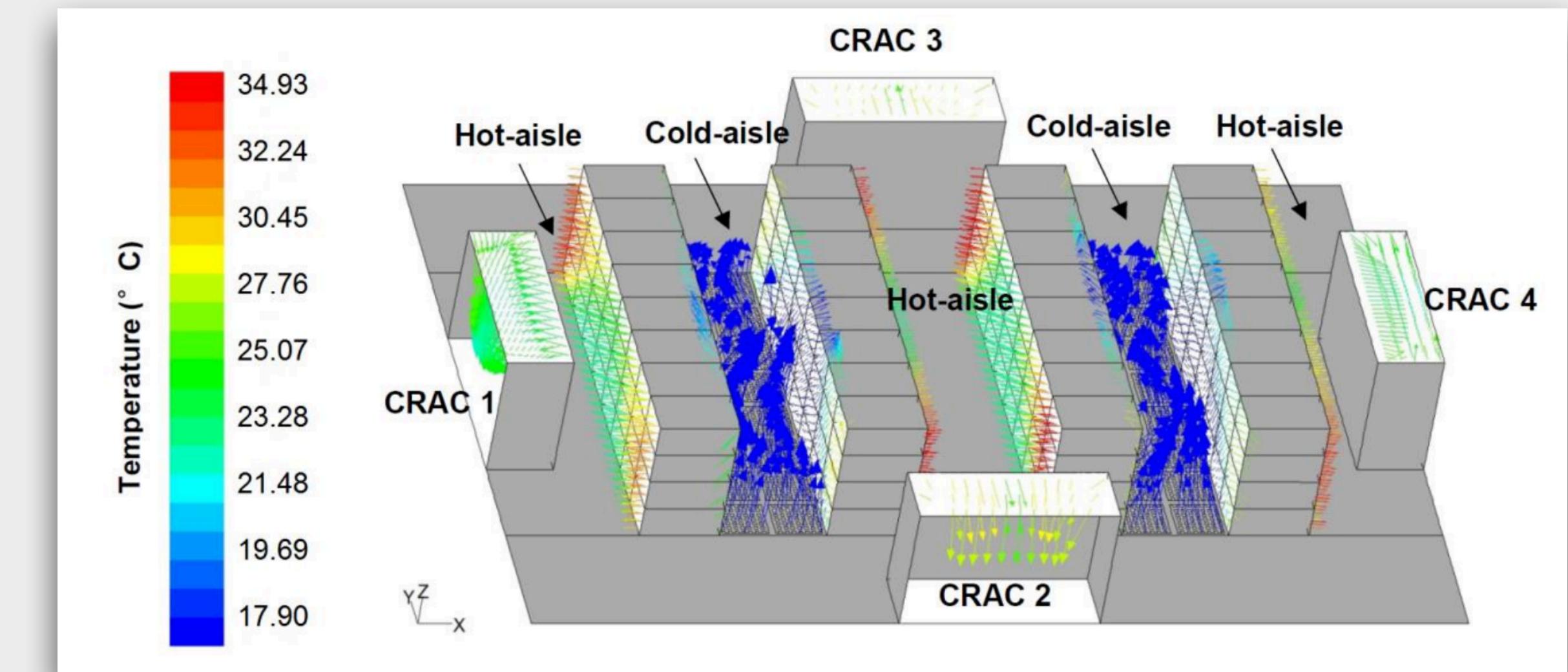
$$K_i T_{out}^i = \sum_{j=1}^N h_{ji} K_j T_{out}^j + (K_i - \sum_{j=1}^N h_{ji} K_j) T_{sup} + P_i,$$
$$T_{in}^i = \sum_{j=1}^N h_{ji} * (T_{out}^j - T_{sup}) + T_{sup},$$



# Data Center Level Simulation

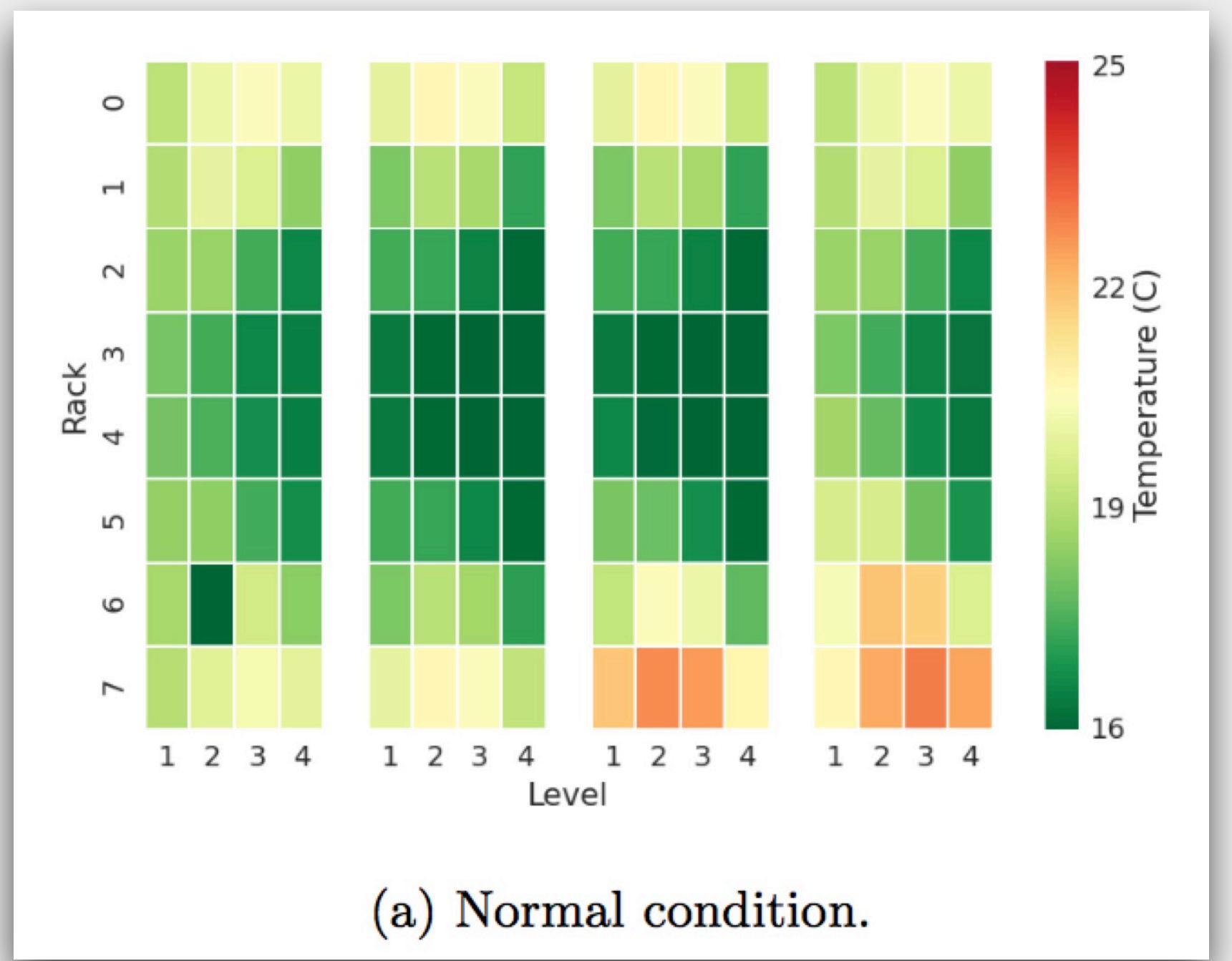
## Data center level: trace-driven computational fluid dynamics analysis.

- $T_{sup} = 16^{\circ}\text{C}$
- $T_{redline} = 25^{\circ}\text{C}$  [1]
- Goal:  $T_{inlet}$  of all servers <  $T_{redline}$



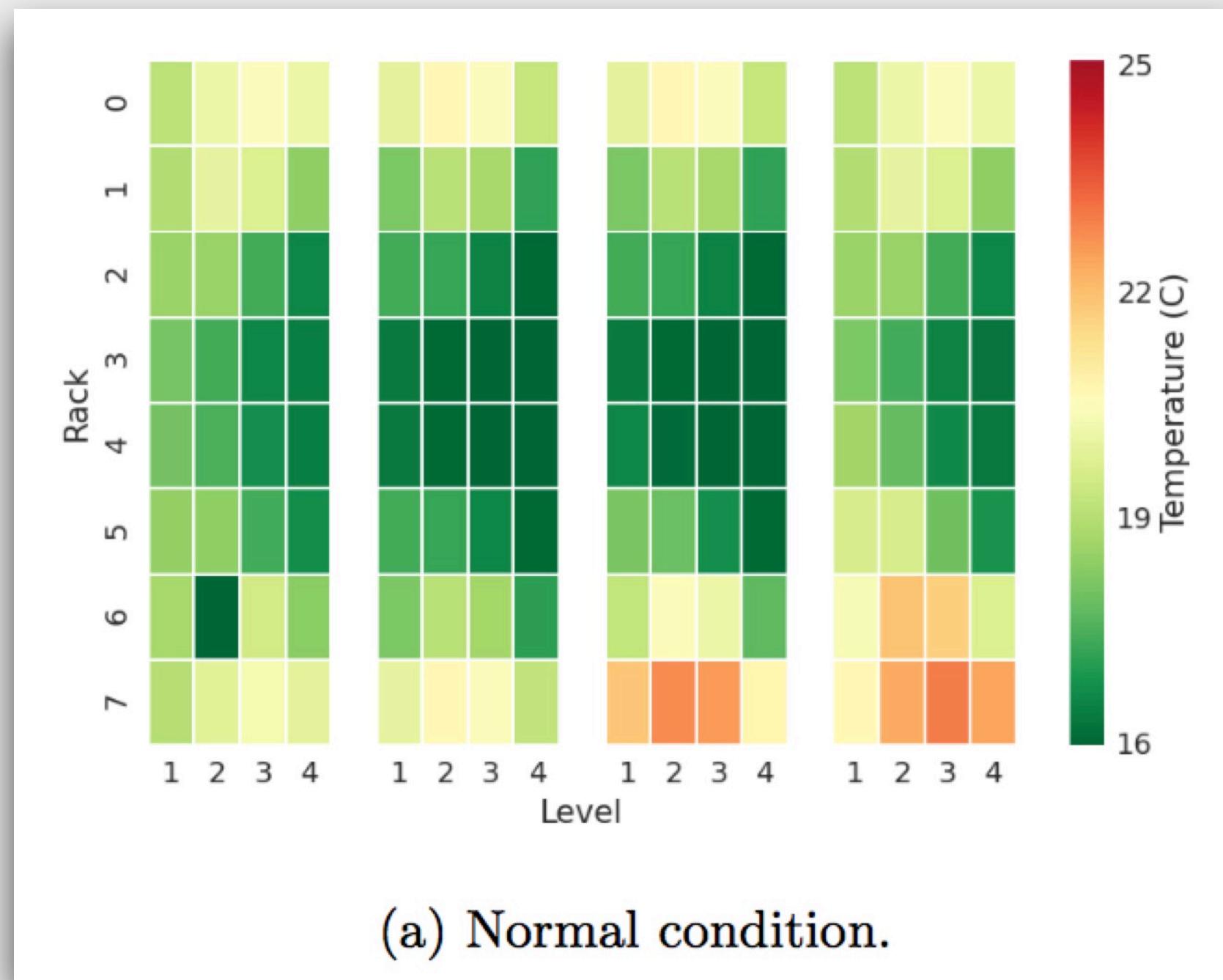
[1] Data center cooling best practices

# Global View



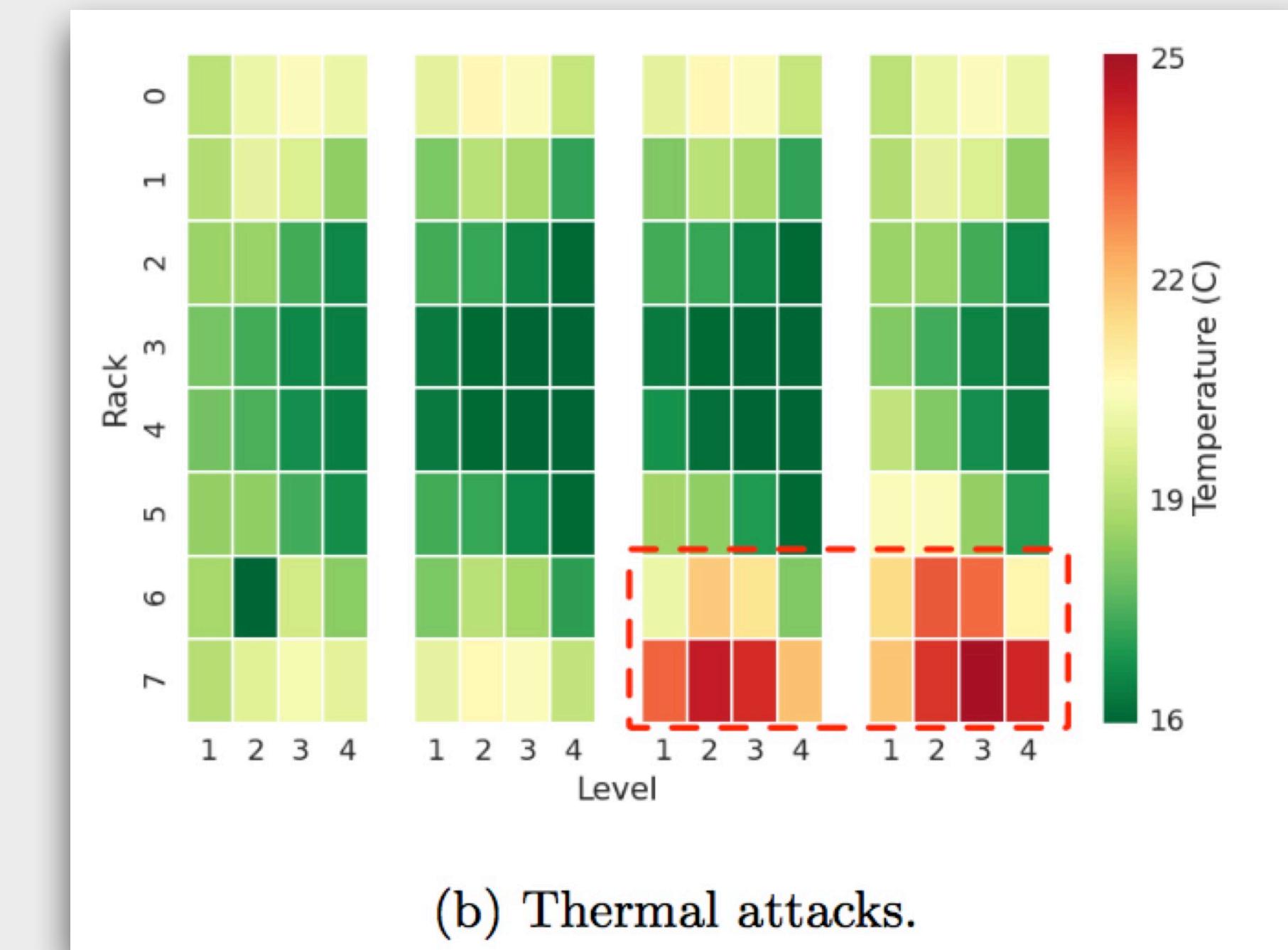
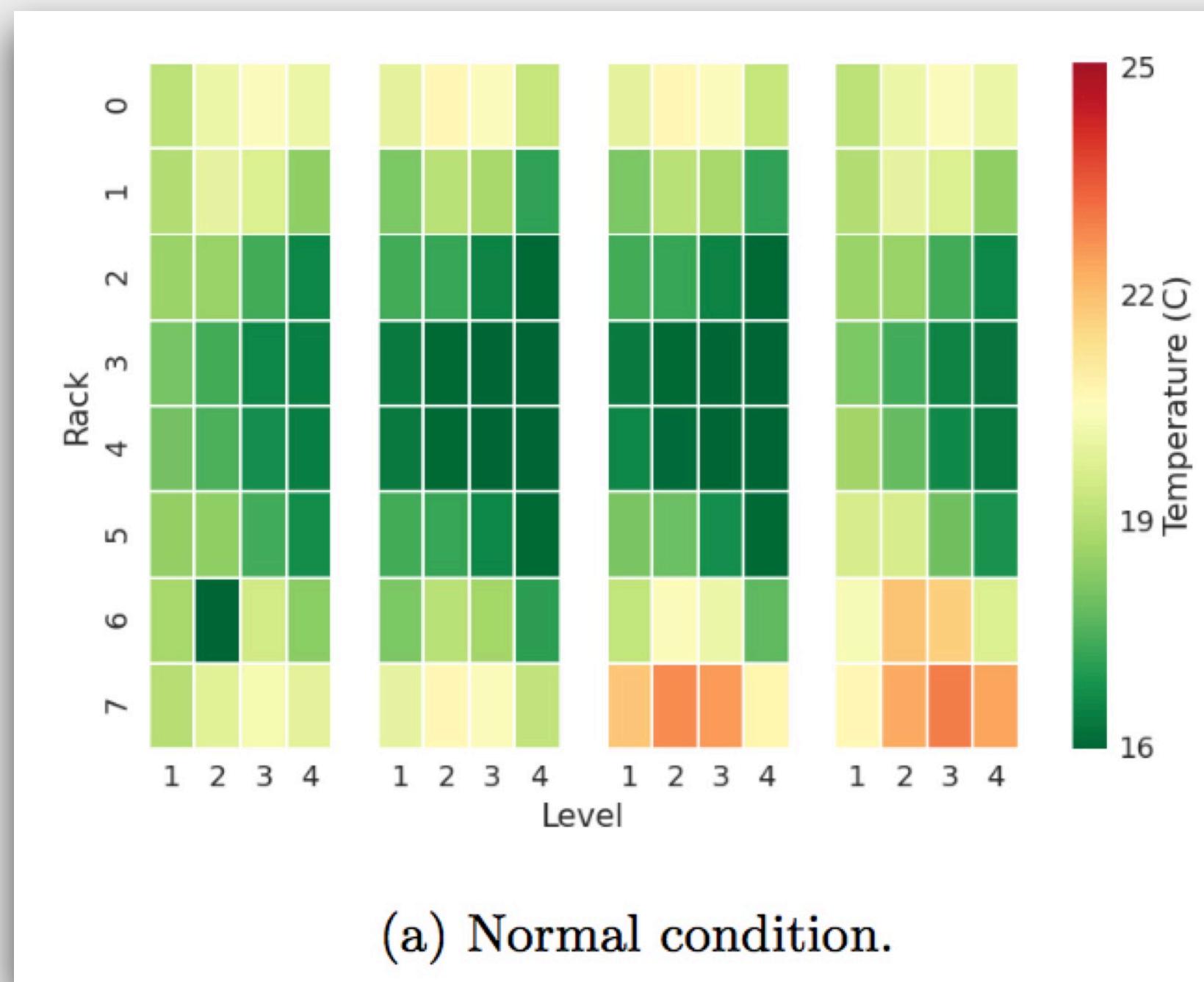
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- Switch to thermal-intensive workloads



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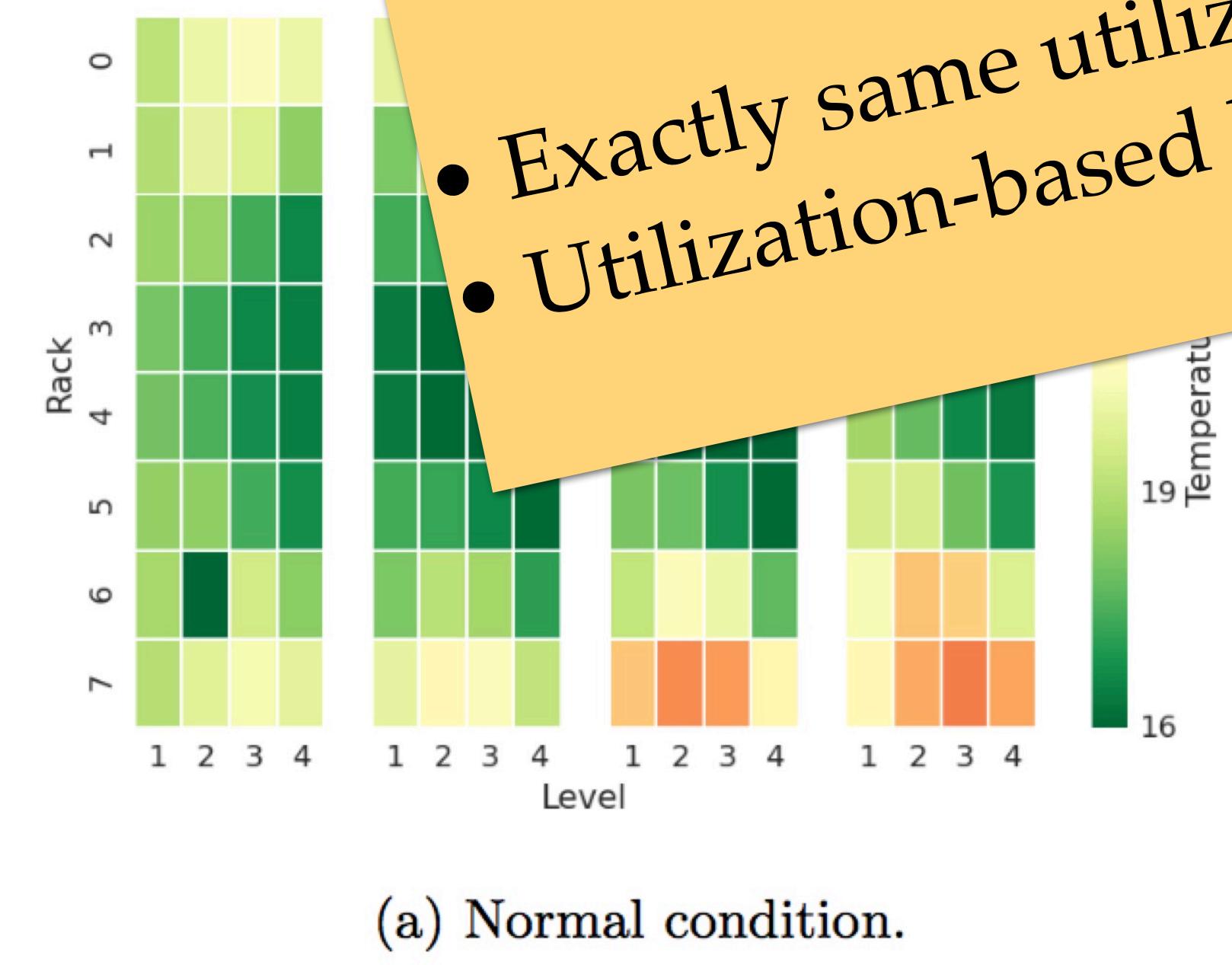
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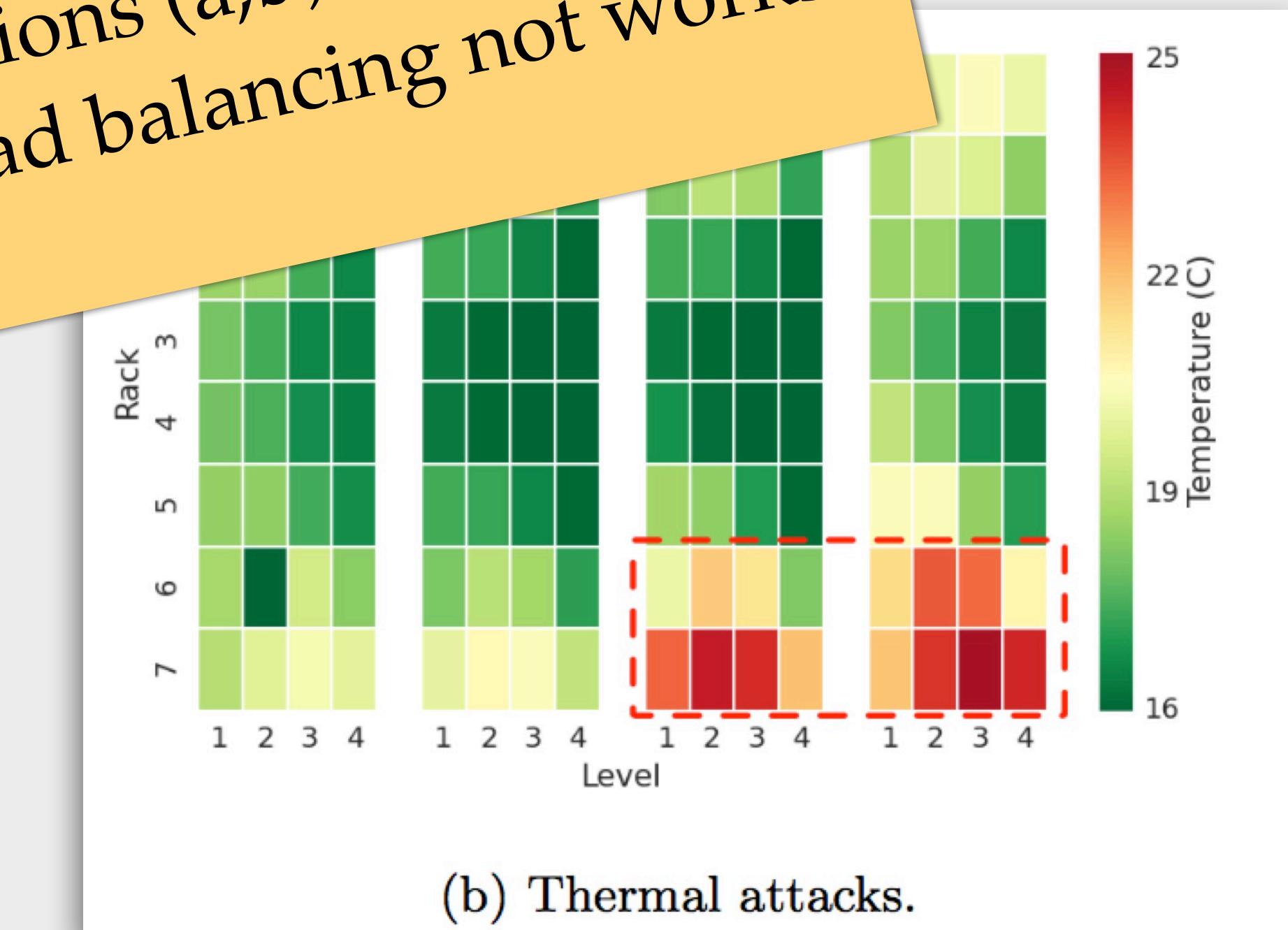
# Global View

- Switch to thermal-intensive workloads

- Exactly same utilizations (a,b)
- Utilization-based load balancing not works!



(a) Normal condition.



(b) Thermal attacks.

# Attacking Efforts



# Attacking Efforts

- ***Three types of attackers***

- *Random*: randomly
- *Rack-level*: achieve rack-level co-residence
- *Hotspot*: attackers can roughly infer the servers located in hotspots

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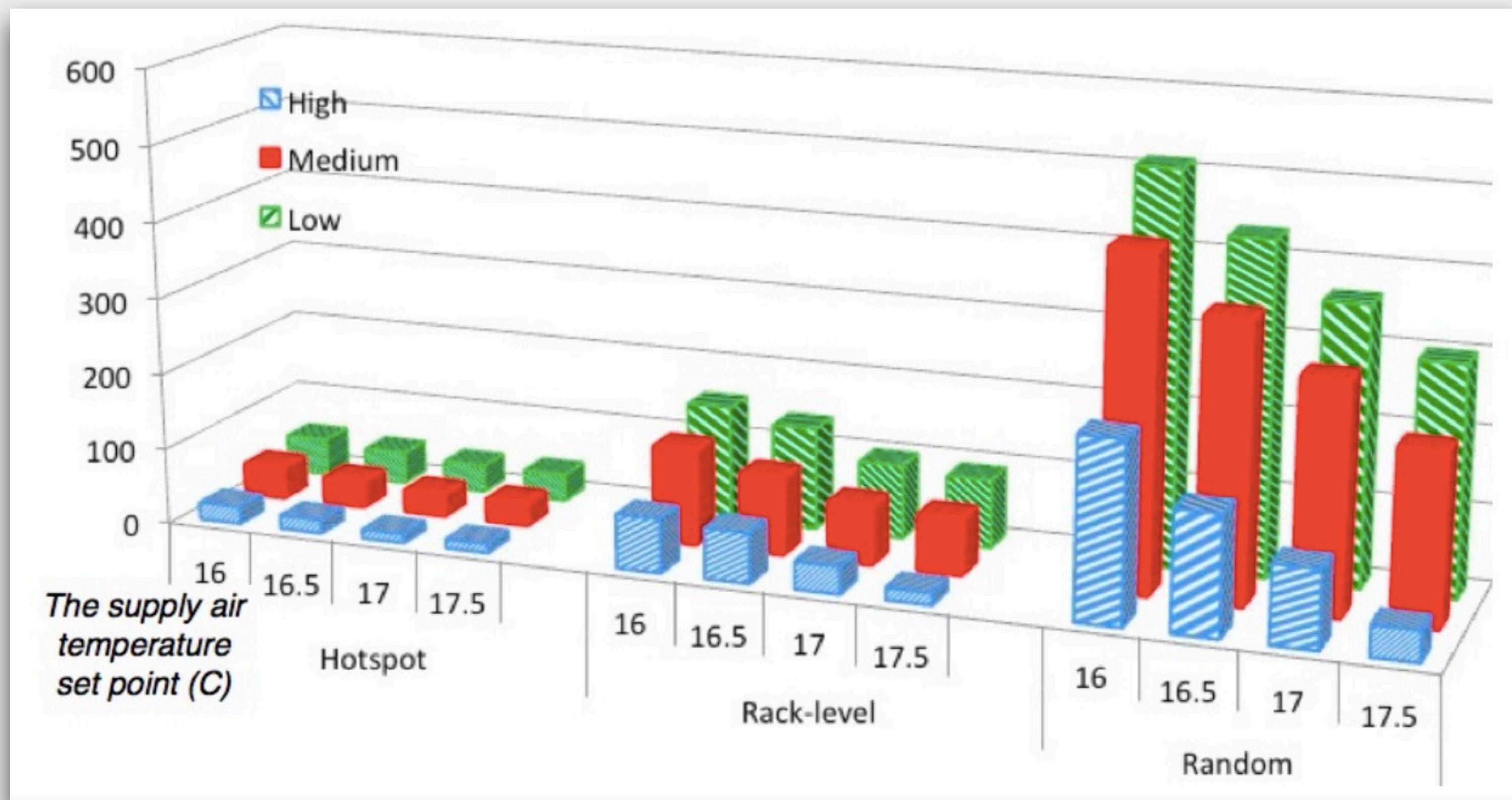
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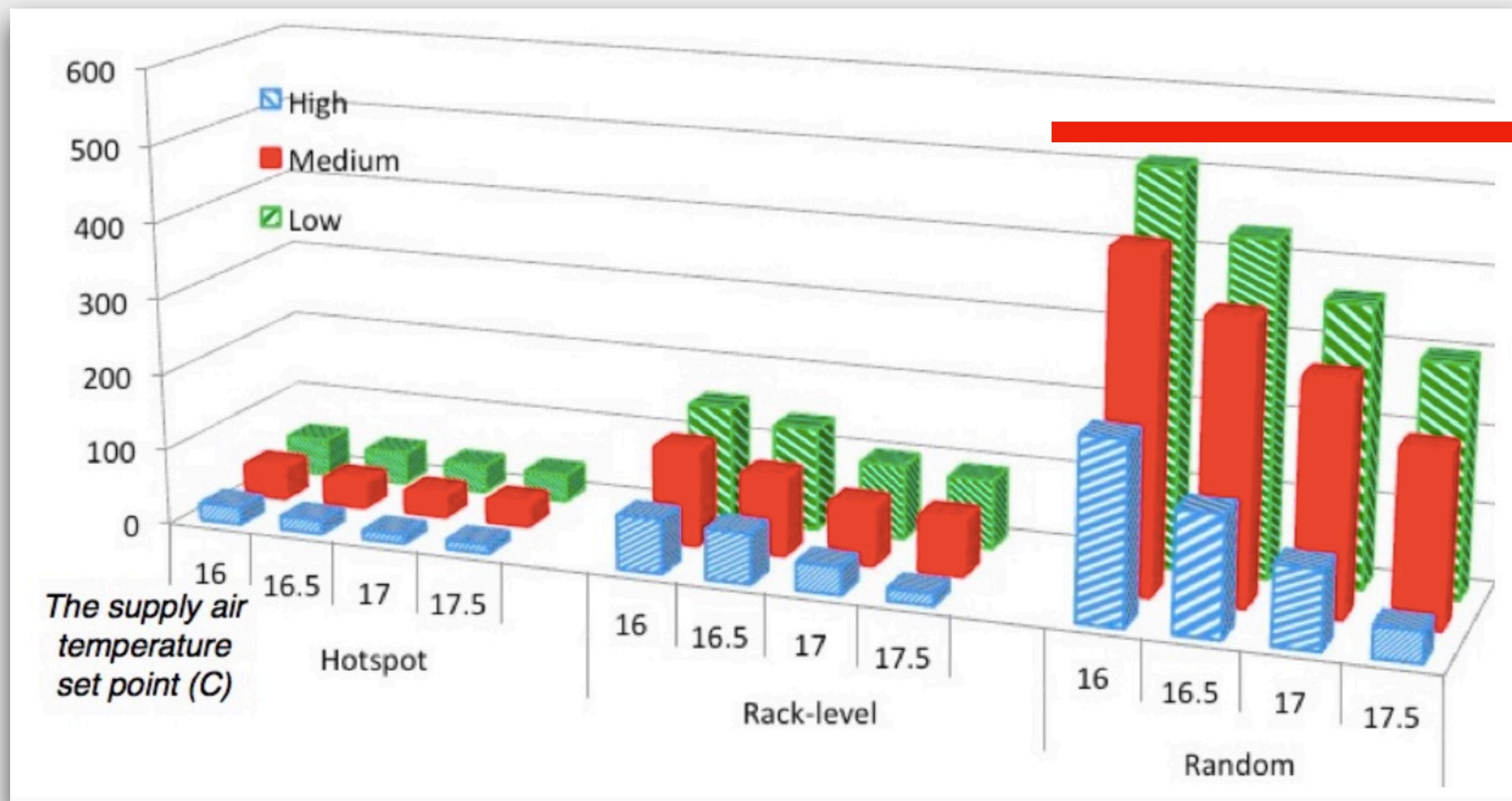
- ***Four different  $T_{sup}$***

- $16^{\circ}\text{C}, 16.5^{\circ}\text{C}, 17^{\circ}\text{C}, 17.5^{\circ}\text{C}$

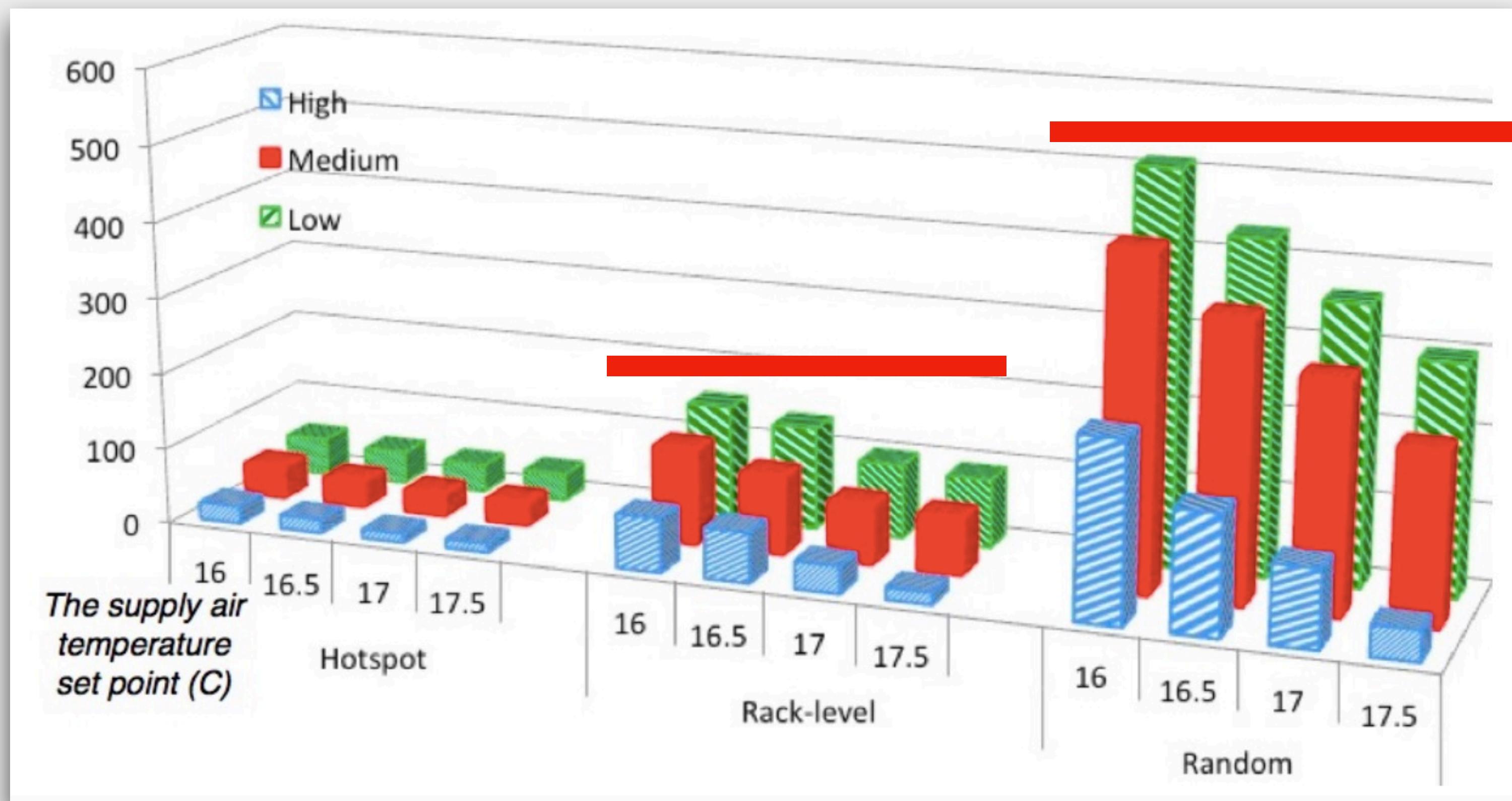
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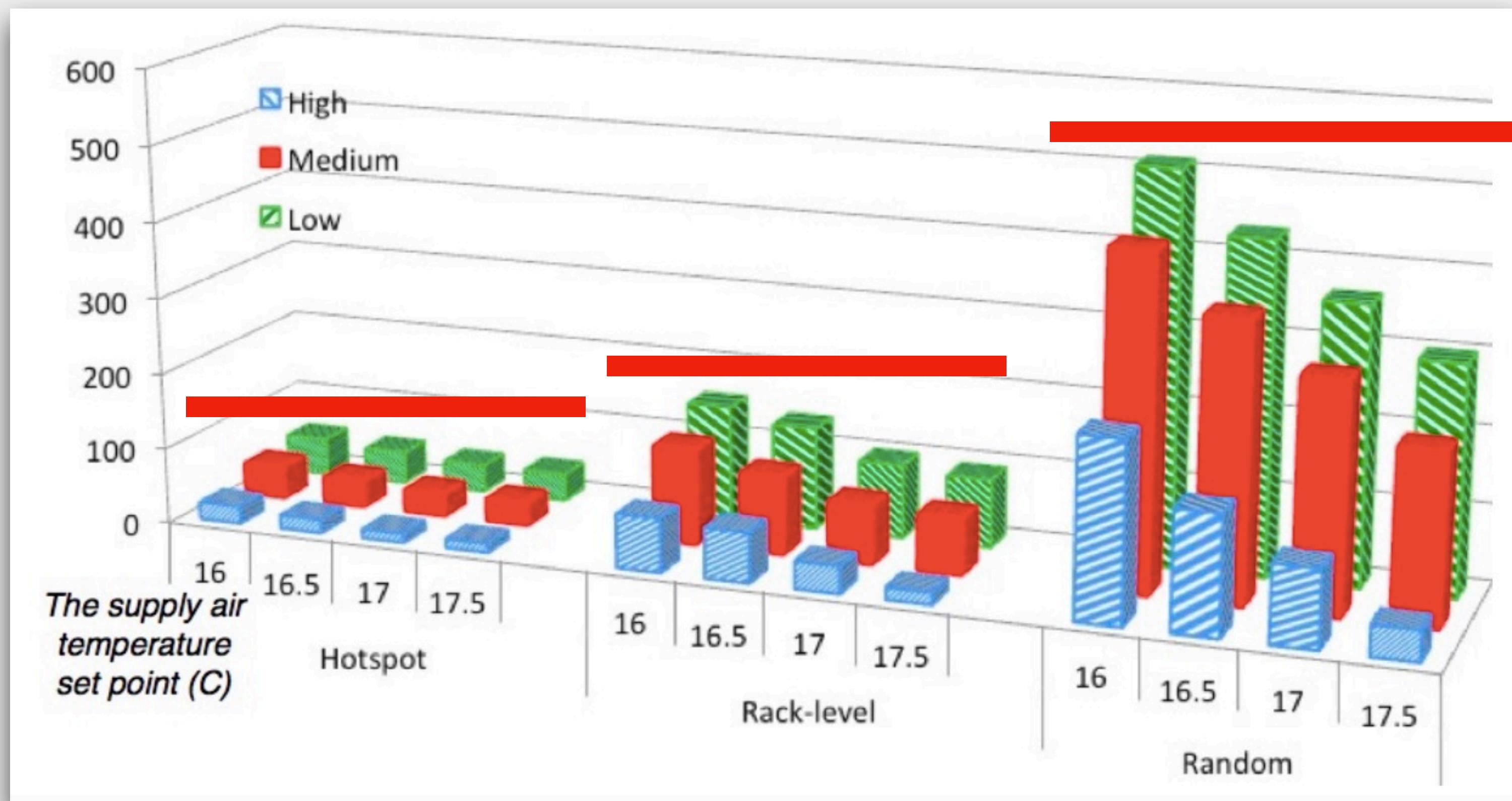
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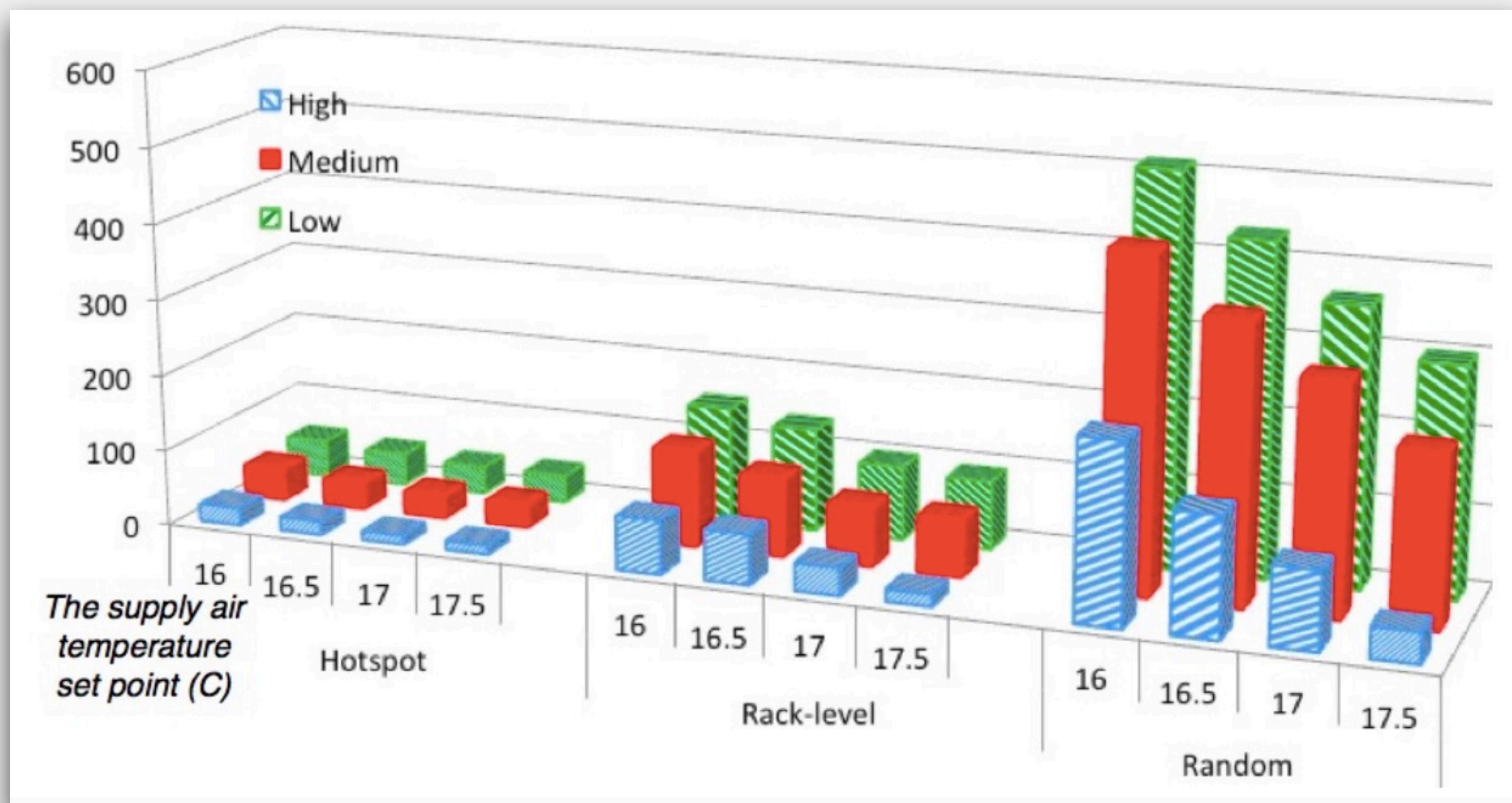
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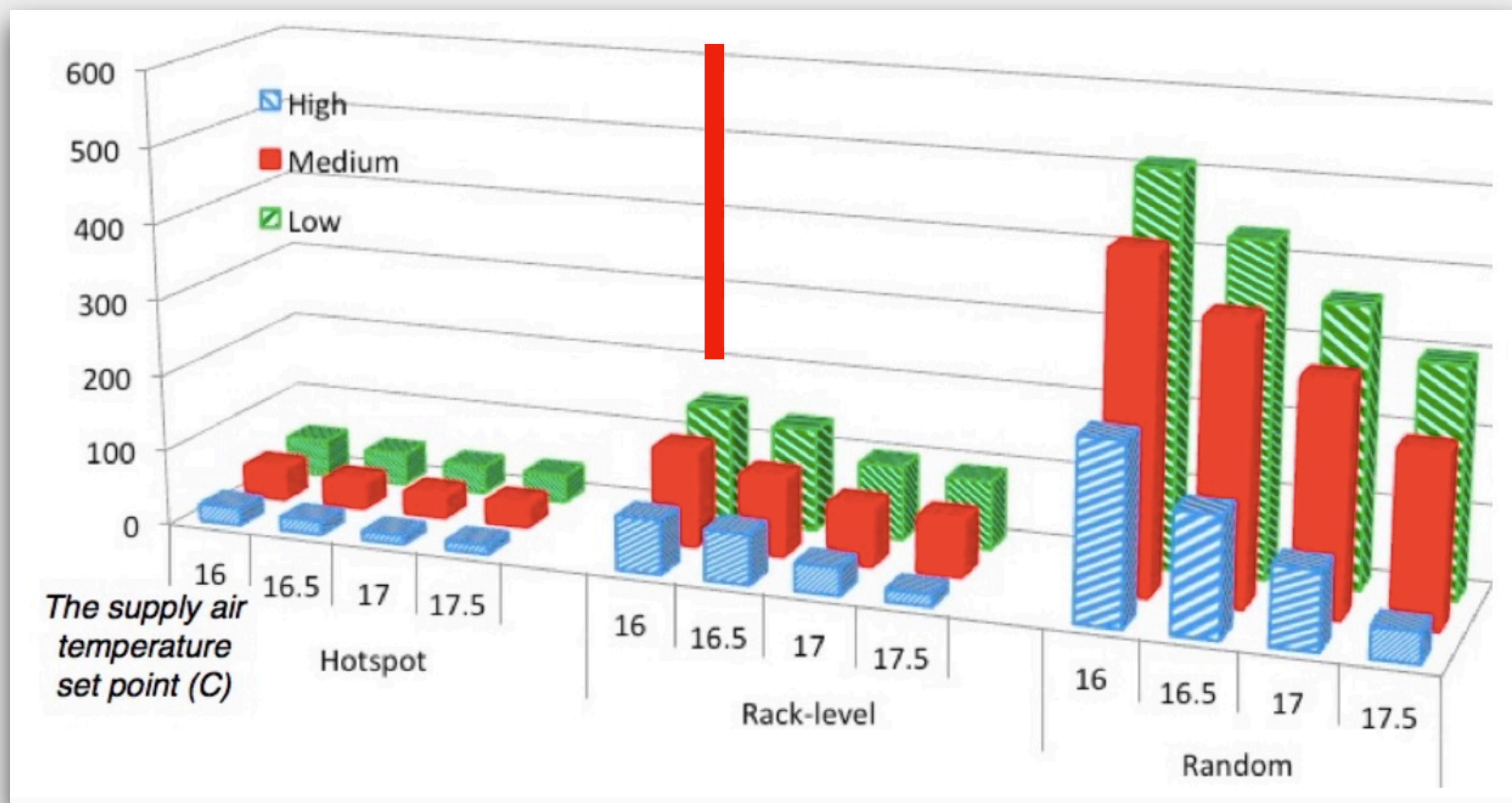
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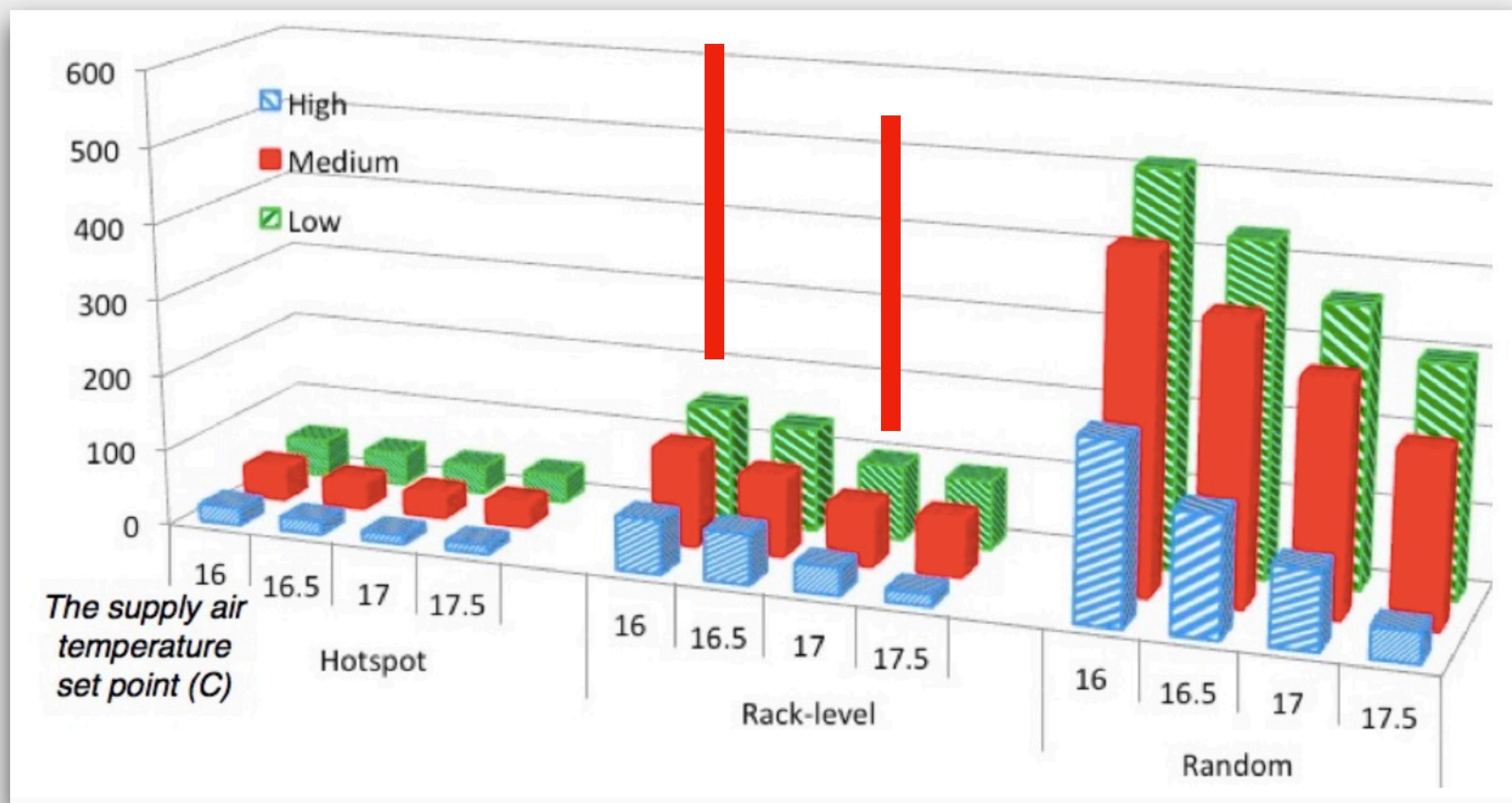
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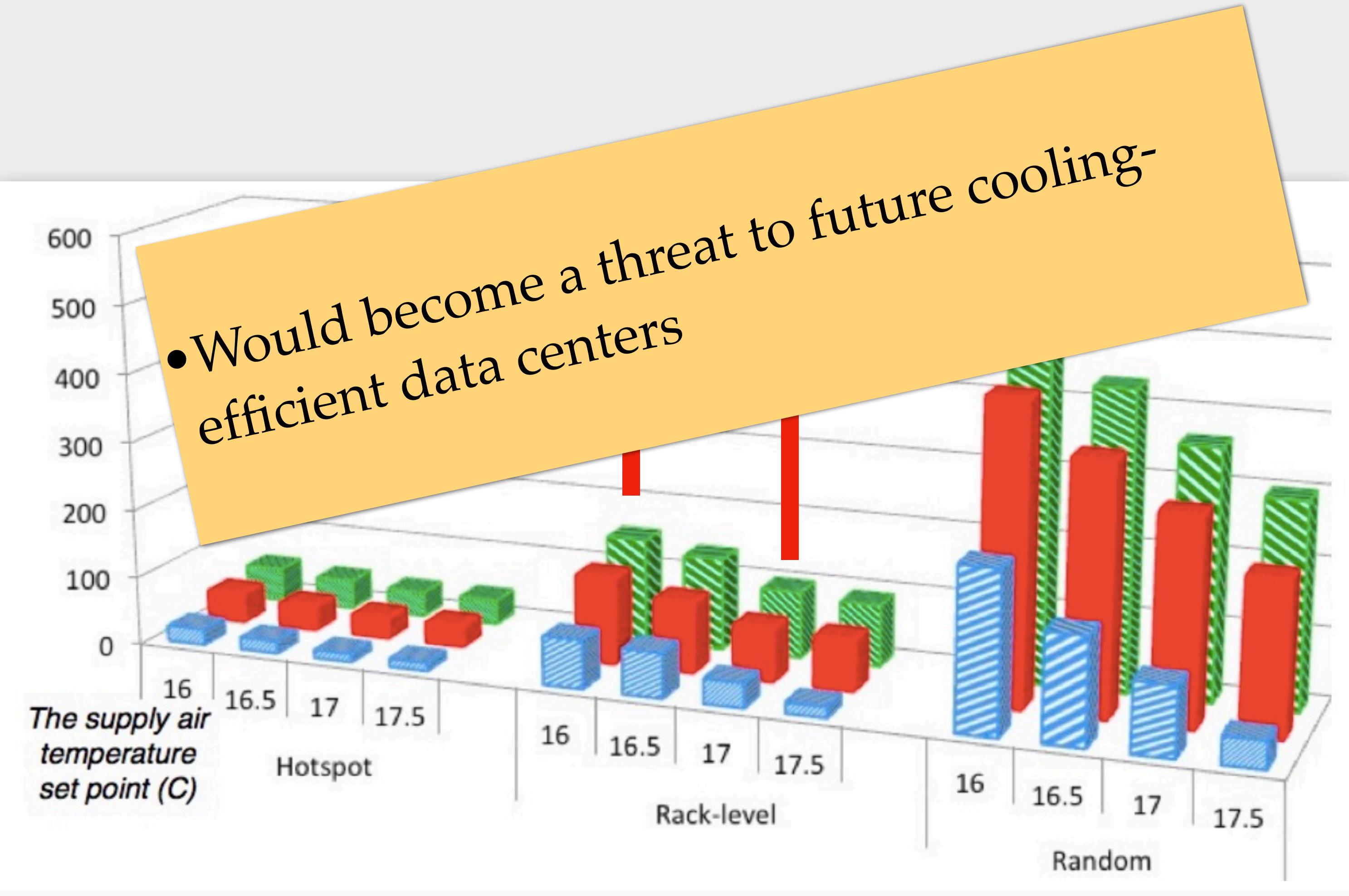
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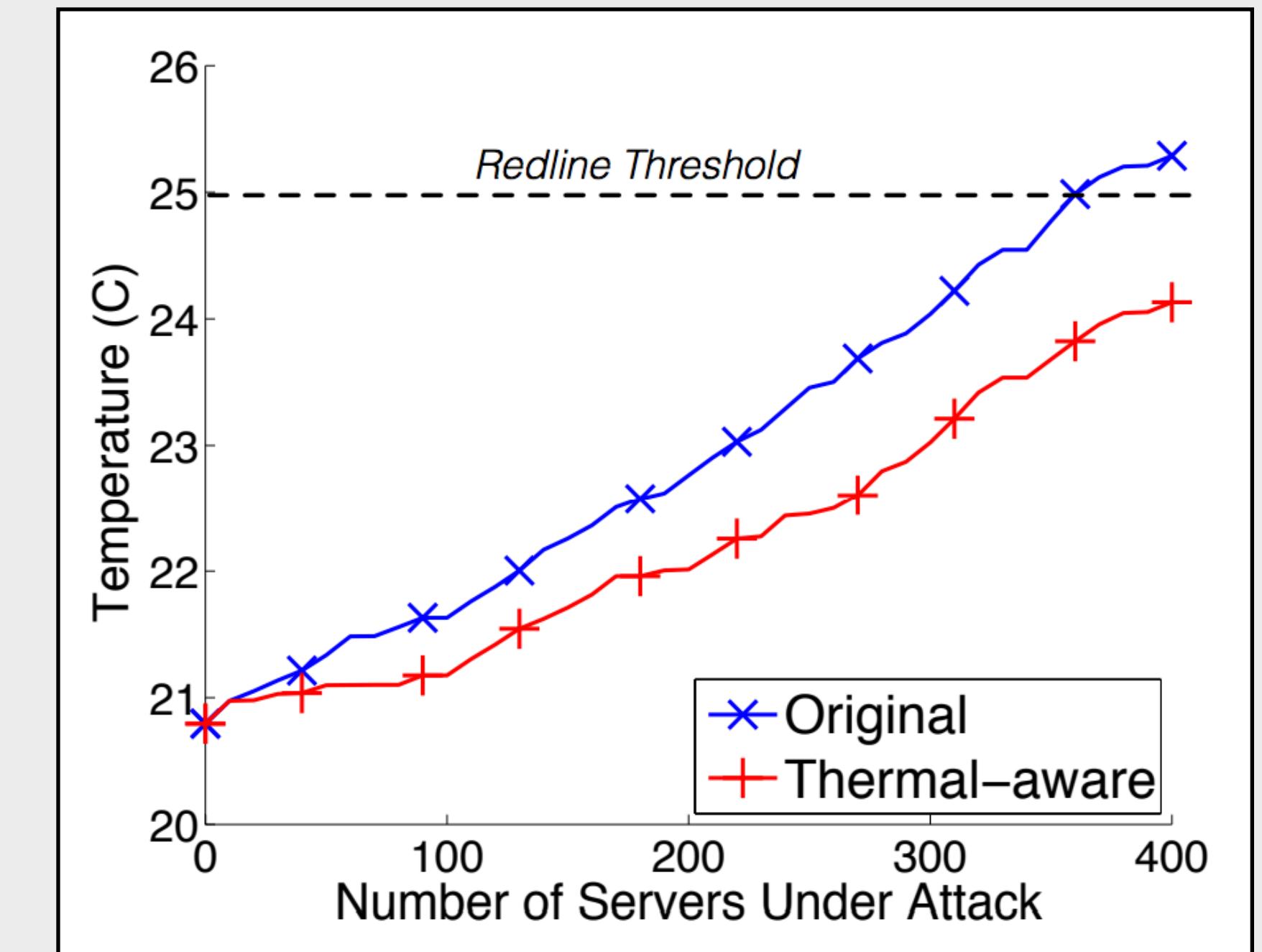


# Preliminary Mitigating Method

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- Robust anomaly detection at chip and server levels
- Cost-effective sensing solutions
- Proactive thermal management on rack and data center levels

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# Summary

- Reveal a new vulnerability of reduced cooling redundancy.
  - Root cause: aggressive cooling saving policy and power-oversubscription
- Conduct testbed experiments and data center level simulation.
- Discuss mitigating methods.



Thank you!